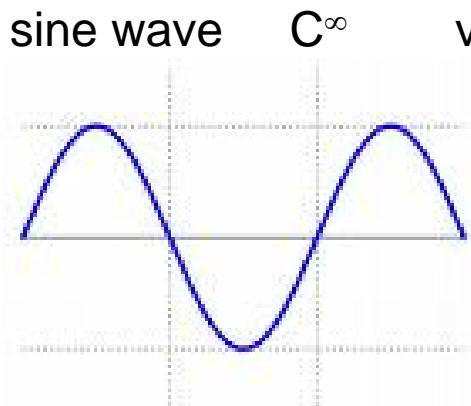


# Quantitative Biofractual Feedback Parts I-III

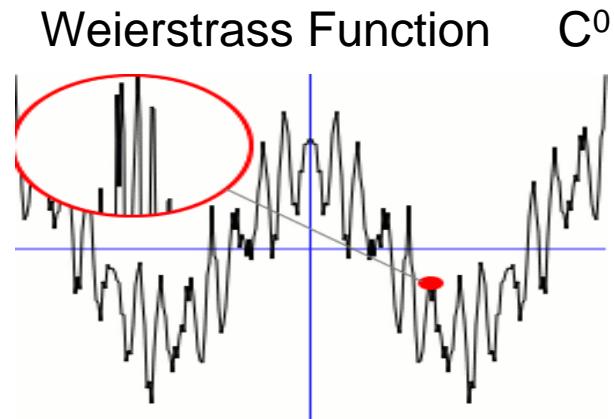
D. W. Repperger  
Air Force Research Laboratory  
AFRL, WPAFB, Ohio 45433,  
USA

## Overall Summary of Parts I, II, and III

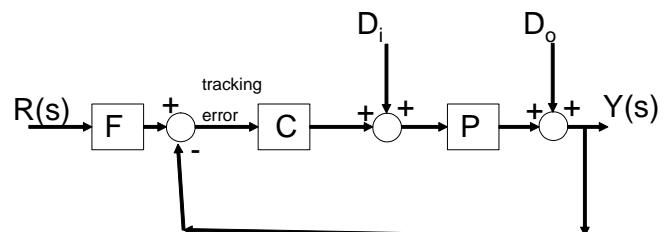
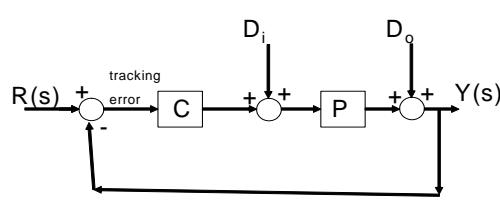
Part I: Fractional Dimension (Fractals, Bioinspired, Intelligent C.)



versus



Part II: Quantitative Feedback Theory



Part III: A Common Problem – *Diffusion Equation*

- Solve the classical way.
- Solve using Laplace Transforms.
- Solve using Fractional Calculus.
- Examine Robustness via Quantitative Feedback Theory.

<b>Report Documentation Page</b>			<i>Form Approved OMB No. 0704-0188</i>		
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# Quantitative Biofractual Feedback Part I

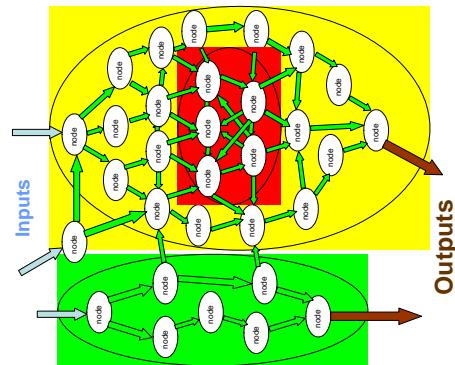


Figure 3 – The Original Network-Centric Distributed System

- . We are now living in a world that is complex, distributed, but may be highly vulnerable.
- . A better understanding of performance, and vulnerability of complex, distributed systems is required. How should we allocate resources for protection?

## **The Part I talk will have four main components:**

- (A) Pose the problem of performance and vulnerability in complex and distributed networks.
- (B) Provide background material on some pertinent areas.
- (C) Using Computational Intelligent methods, solve a related problem. This will be a “brute force” approach.
- (D) Finally, hypothesize some theoretical approaches.

# Part 1-A- Pose the Problem:

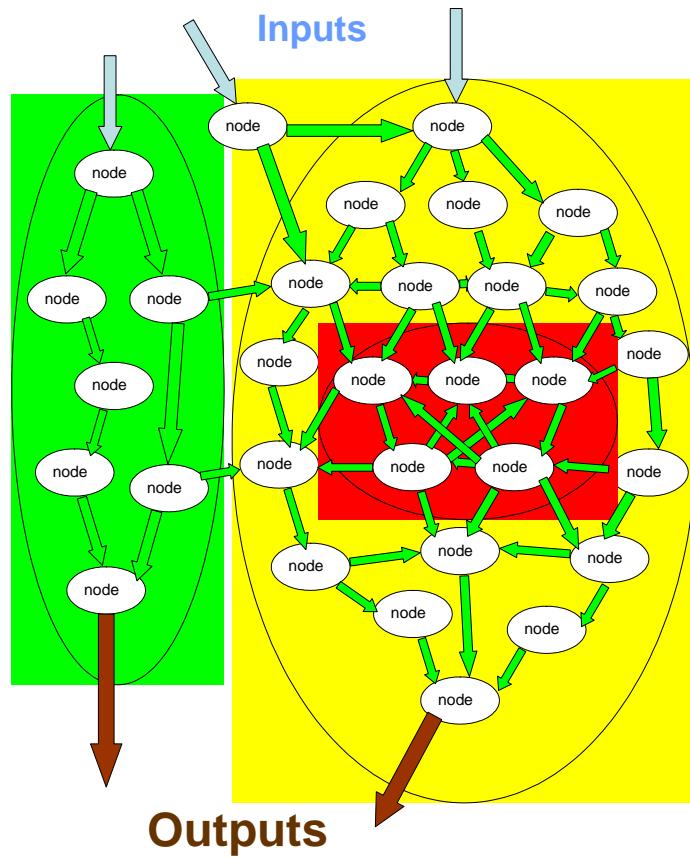
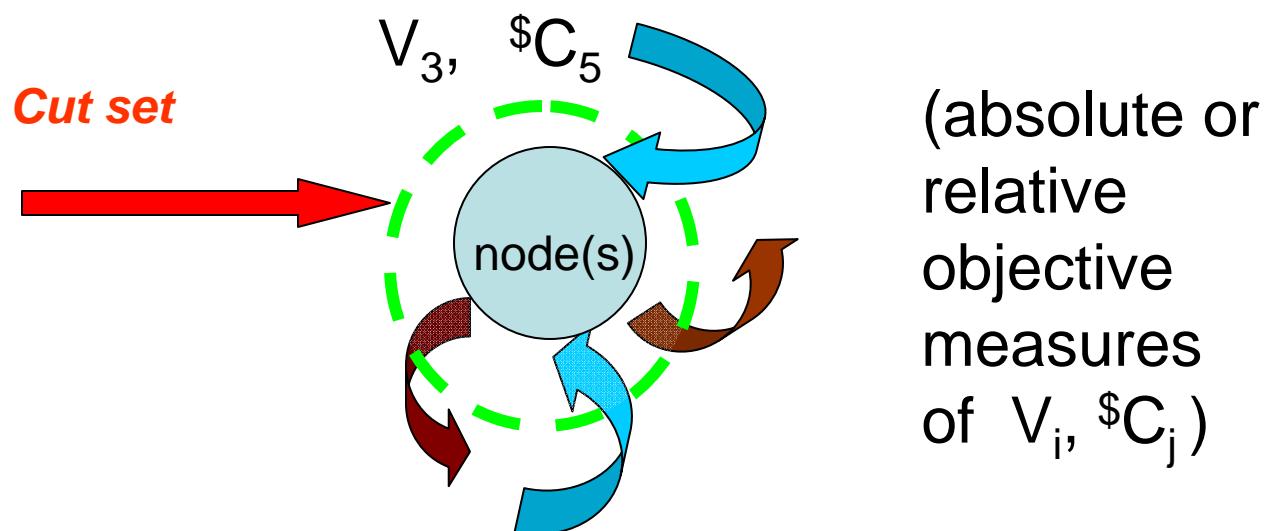


Figure 3 – The Original Network-Centric Distributed System

**Performance:** Rate of flow through the network.

**Vulnerability:** Sensitivity of performance to attack of node.



# Part 1-A- Pose the Problem:

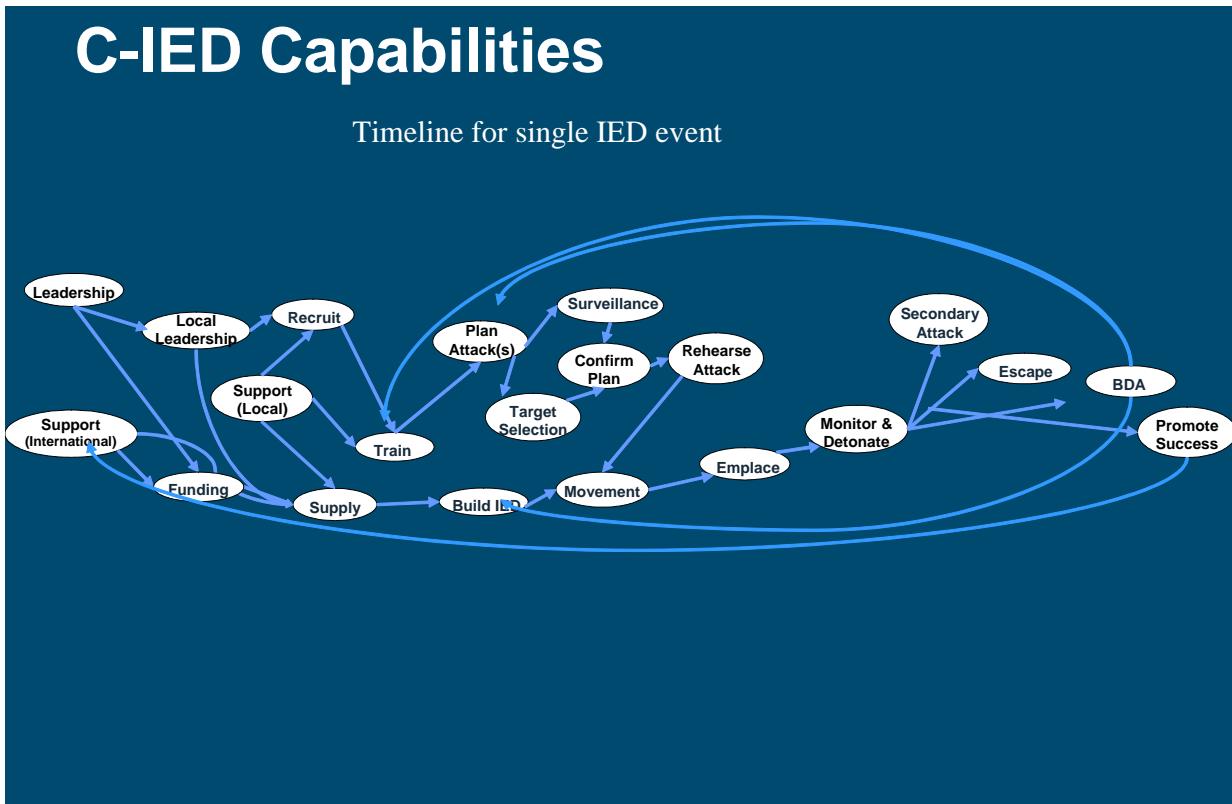
Some examples of important networks:

- (1) Power grids, railroad tracks,  
financial systems, etc..
- (2) Flow of people, water, food, medicine.
- (3) Communication systems.
- (4) Information networks (Internet),  
email systems.
- (5) Physiological systems (blood, oxygen,  
heart attack, cell networks in biology).

***(Some networks we may wish to destroy.)***

# Part 1-A- Pose the Problem:

## One Network we wish to destroy:



21 March 2007  
© Dstl 2001

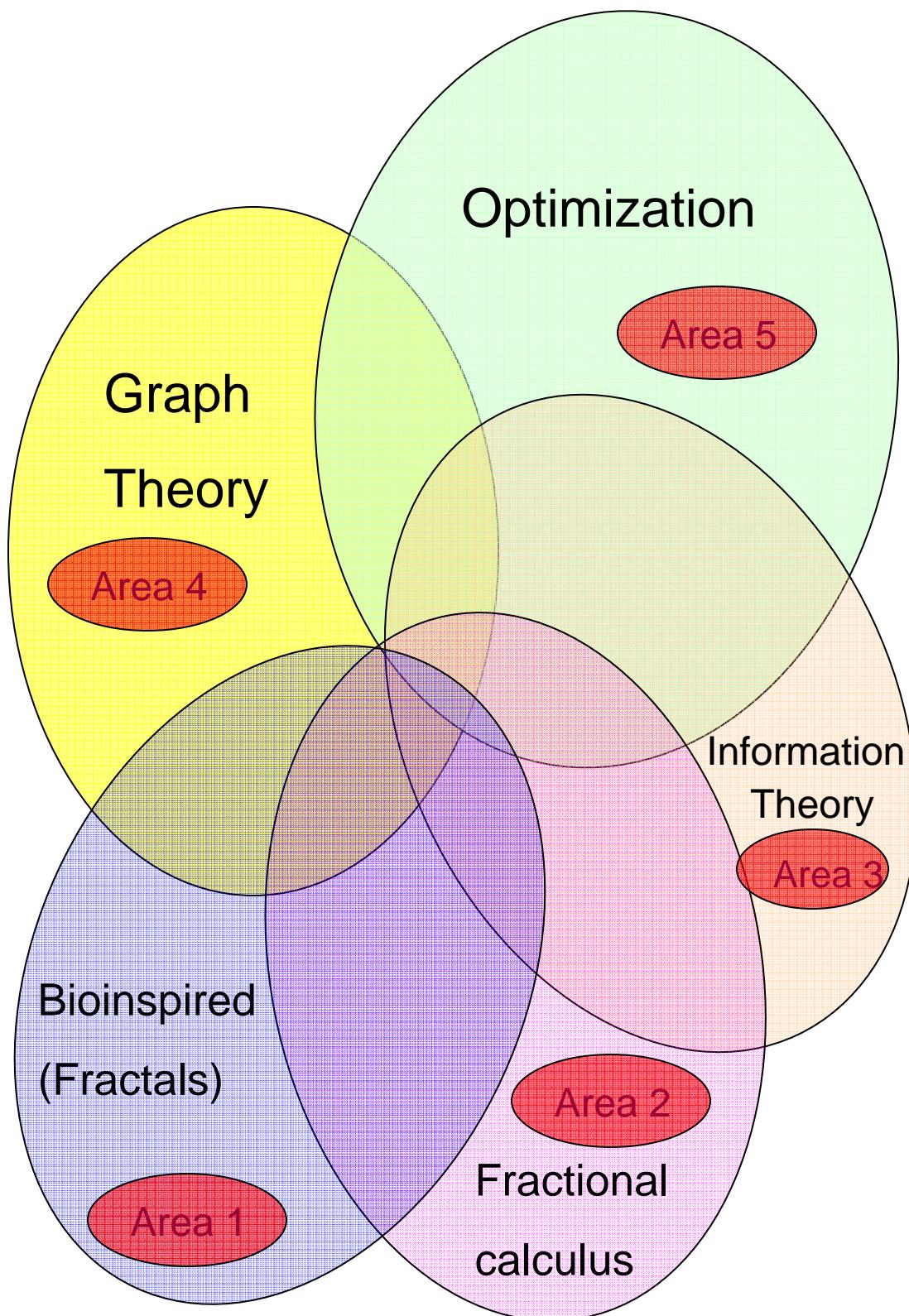


Dstl is part of the  
Ministry of Defence

A second important network to introduce congestion or denial of service:

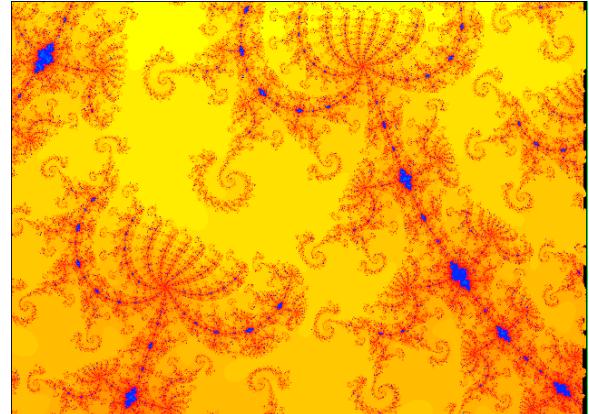


# Part 1-B- Background Material



# Part 1-B- Background Material

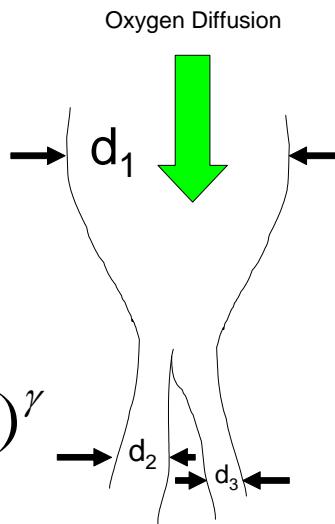
## Bioinspired - Fractals



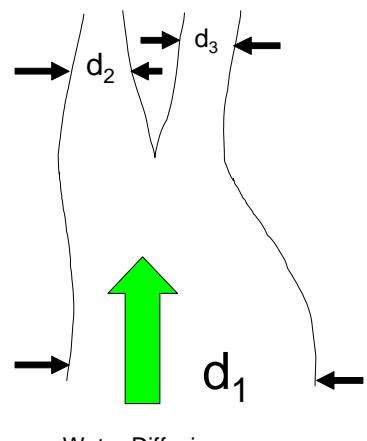
$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t}$$

$$(d_1)^\gamma = (d_2)^\gamma + (d_3)^\gamma$$

$$\gamma = 2.5??$$

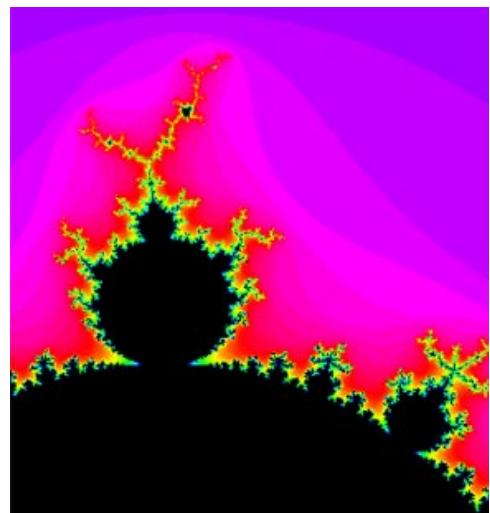
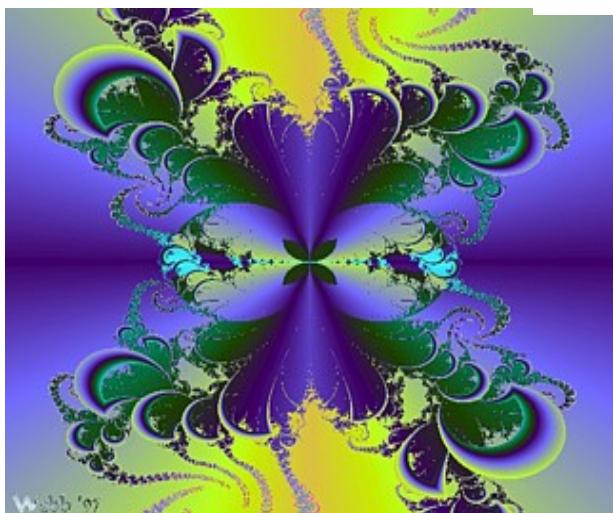


Lung



Tree

Fractional Dimensions are **NOT** Minimum energy – They are **Optimal** for Diffusion



# Part 1-B- Background Material

Area 1

## Bioinspired - Fractals

- . The Latin ***fractus*** = “broken” or “fractured”
- . Fractals – scale free (self-similar), irregular overall length scales. (self similar means the structure is invariant to change in scale). ***Forever continuous but nowhere differentiable.***
- . Fractals may have ***infinite circumference but finite area.***
- . Fractals can have ***finite volume and infinite area.***
- . A fractal can be defined in the sense of a recursive equation:  
$$z_{n+1} = f(z_n)$$
- . This is, apparently, the ***optimal way*** to distribute flow.
- . Non Euclidean Geometry.
- . Fractal examples (trees (branches), rivers, lightning bolts, cells, lung passageways, blood vessels, leaf patterns, cloud surfaces, molecular trajectories, neuron firing patterns, etc.).

# Fractals – Lets Review the Area

Area 1

B. Mandelbrot (1960,s) asked the question: “How long is the coastline of Britain?”

(Suppose we measured the coastline with a ruler that got smaller and smaller?)



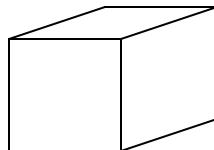
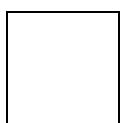
A fractal has statistical self-similarity( power law, self affine).

A fractal has N identical parts with scale factor L.

## The Hausdorff dimension is

$$\text{Area} = L^2$$

\_\_\_\_\_



$$\text{Length} = L$$

$$\text{Volume} = L^3$$

$$(\text{Measurement}) = L^D$$

$$\text{implies } \log(\text{Measurement}) = D (\log(L))$$

$$D = \frac{\log(\text{Measurement})}{\log L} \neq \text{Integer}$$

## Fractals – Lets Review the Area

Area 1

$$D = \frac{\log(\text{Measurement})}{\log L}$$

$$(\text{Measurement}) = L^D$$

$$L \propto A^{1/2} \propto V^{1/3}$$

For irregular surfaces, we can define:

Let  $N$  = the number of divisions of fixed length.

Let  $r$  = length of a ruler.

$$D = \frac{\log(\text{Total Length})}{\log(1/r)} \text{ as } r \rightarrow 0$$

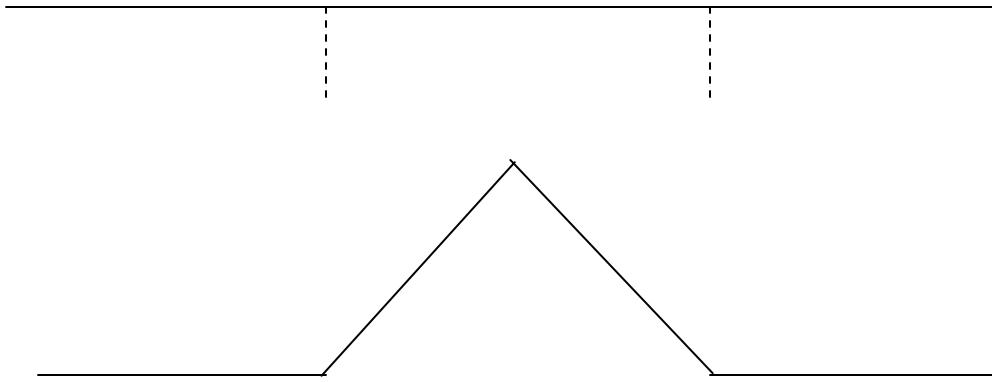
## Fractals – Lets Review the Area

Area 1

$$D = \frac{\log(\text{Measurement})}{\log L}$$

Total Length =  $L^D$  where  $1 < D < 2$

### Koch Snowflake



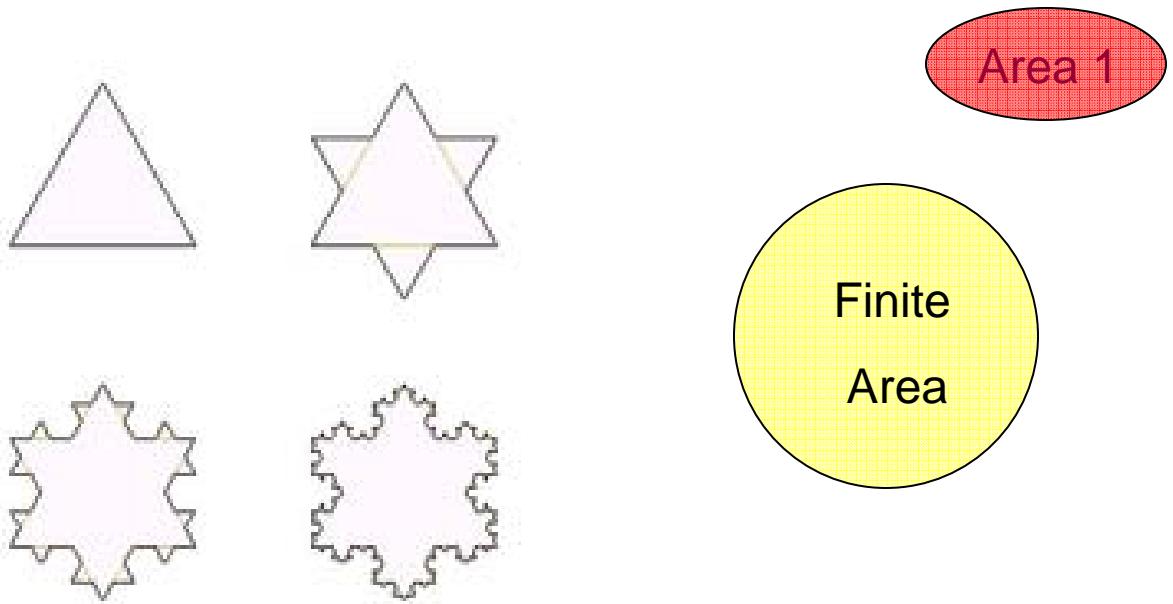
Length = 4 = measurement

Projection = topological dimension = 3

$$D = \frac{\log(4)}{\log(3)} = 1.26185\dots$$

# Fractals – Lets Review the Area

## Different versions of the Koch snowflake.



Circumference

= total length

$$= (4/3)^n$$

$$\lim_{n \rightarrow \infty} (\text{total length}) \rightarrow \infty$$

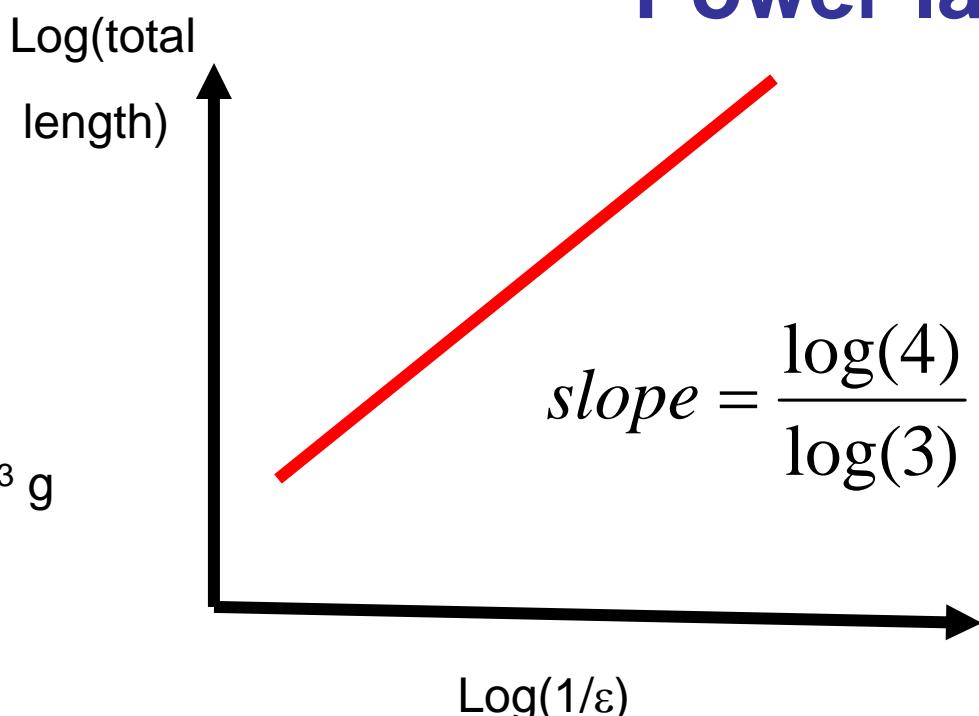
**Power law**

Biofractals

21 orders of magnitude

Microbe =  $10^{-13}$  g

Whale =  $10^8$  g



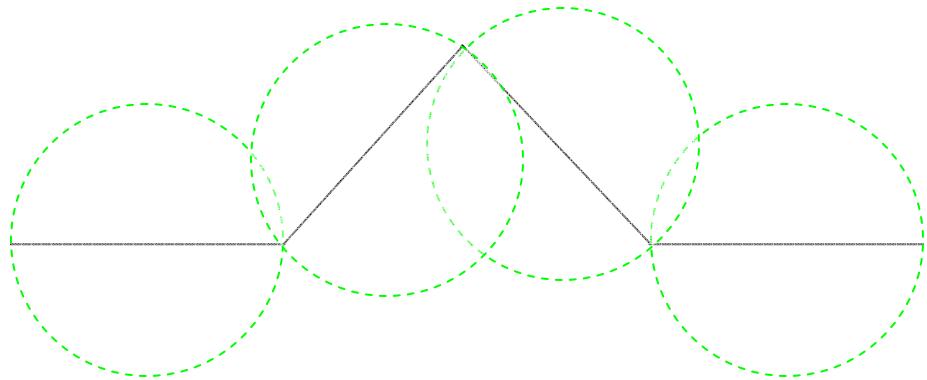
# Fractals – Lets Review the Area.

Area 1

$$D = \frac{\log(\text{Measurement})}{\log L}$$

How to determine Measurement?

We “cover” with boxes or disks.



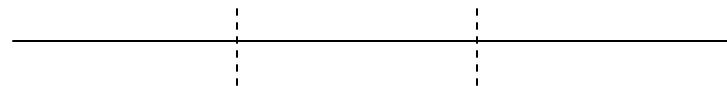
# Fractals – Cantor Set (Cantor Dust)

Area 1

$$D = \frac{\log(Measurement)}{\log L}$$

(remove the middle third)

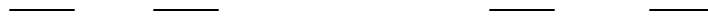
Basic



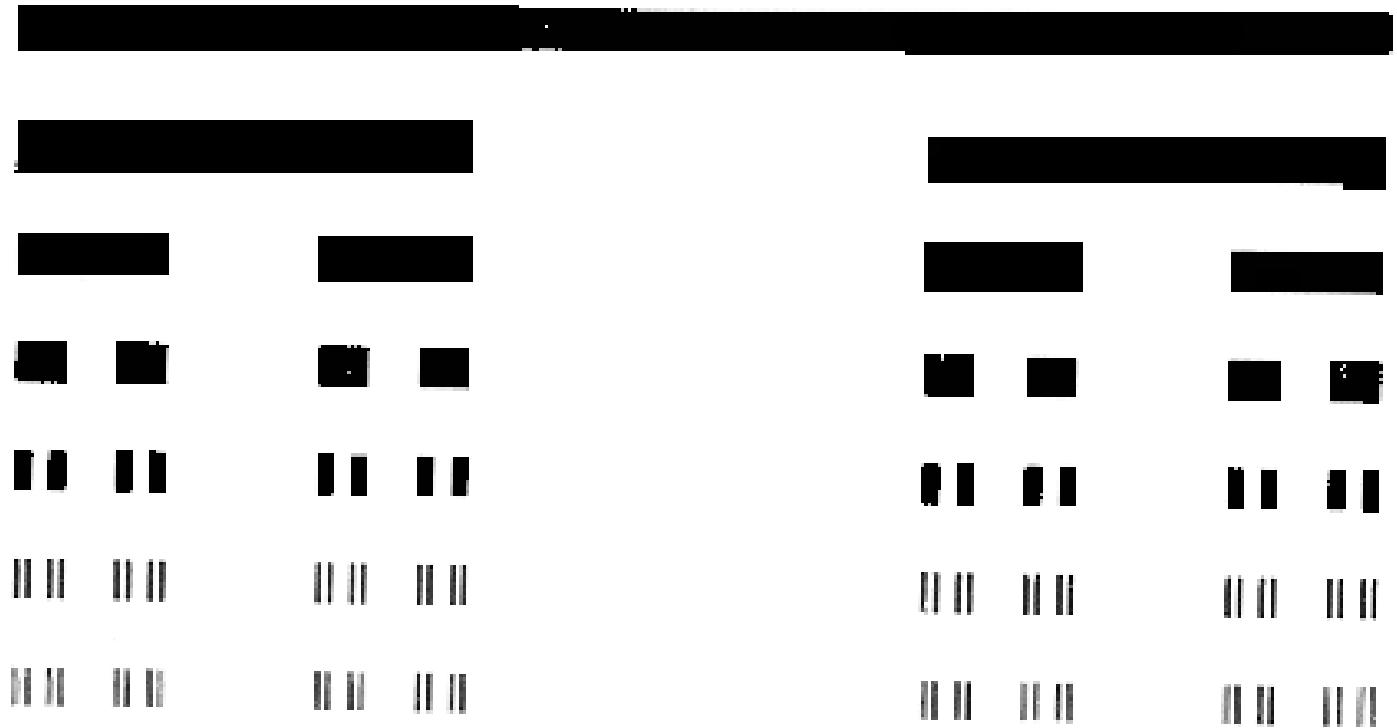
2/3



2/3 (2/3)



$$D = \frac{\log(2)}{\log(3)} = 0.63092\dots$$



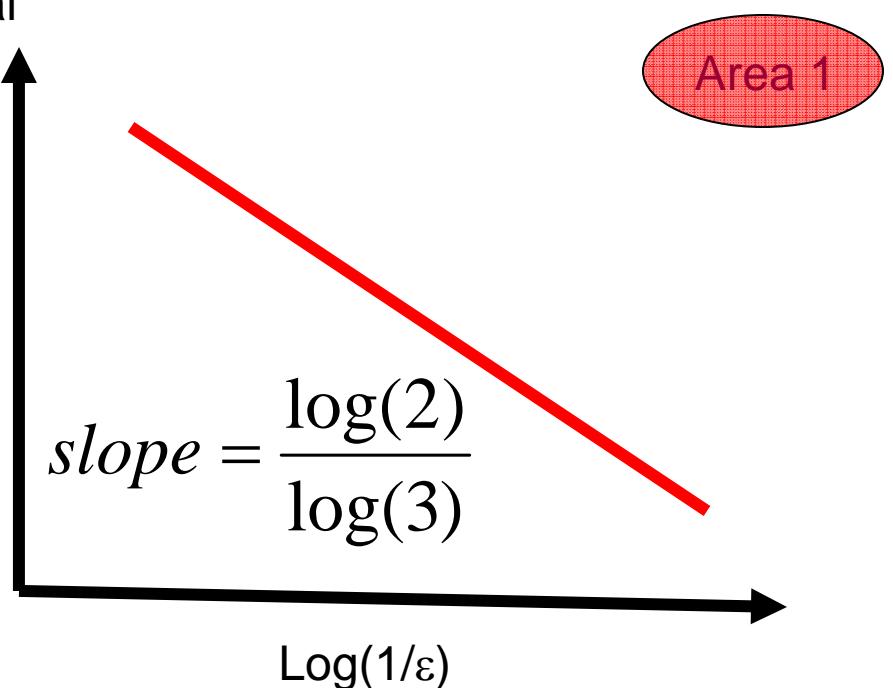
Total length

$$= (2/3)^n$$

Deleted points of Lebesgue measure 1, the remaining points of Lebesgue measure 0.

$$\lim_{n \rightarrow \infty} (\text{total length}) \rightarrow 0$$

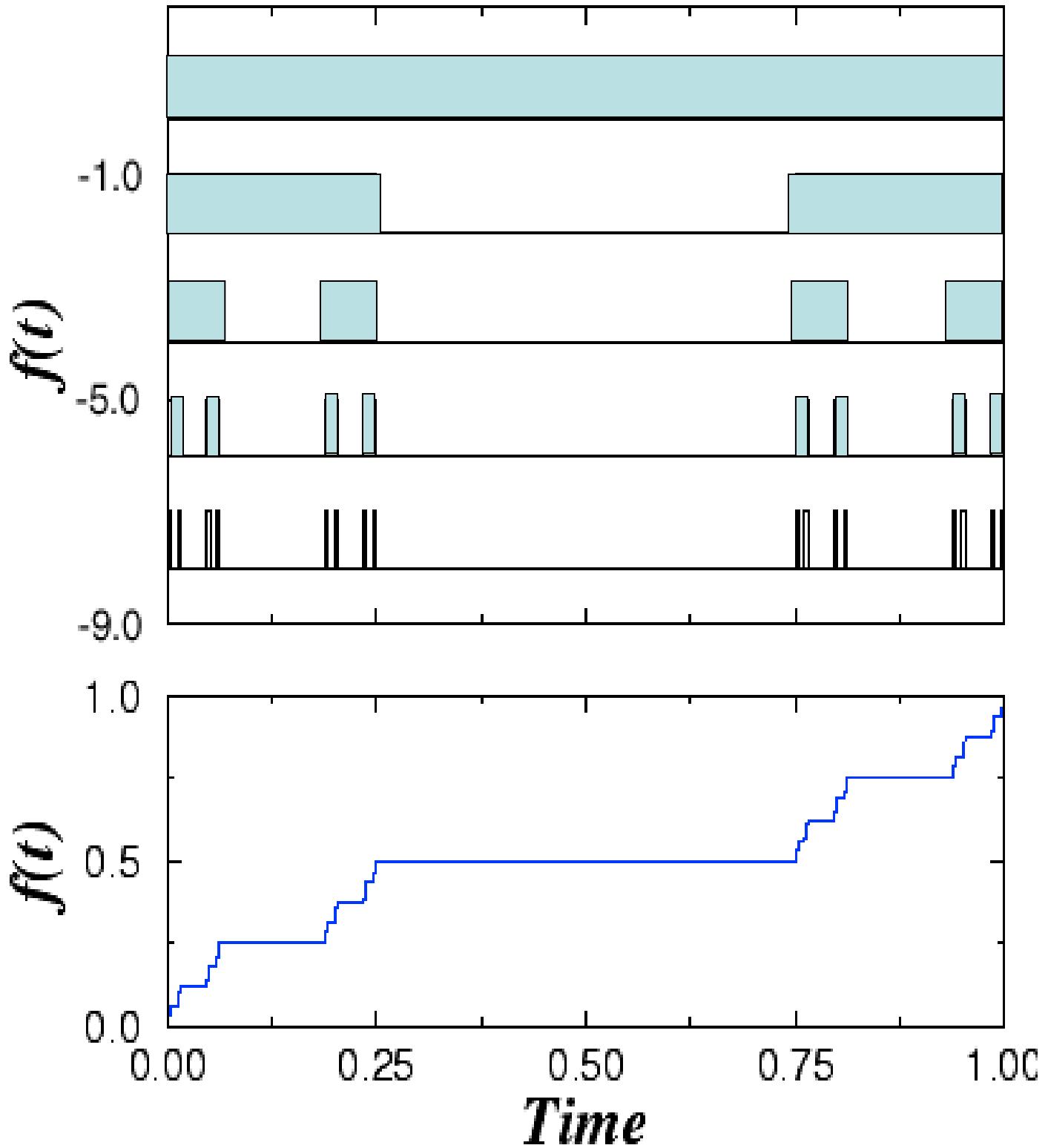
## Power law



# What is the Complement of the Cantor Dust Set?

The set of deleted points of Lebesgue measure 1

The remaining points of Lebesgue measure 0.



# Fractional Calculus – Main Points

(non Euclidean geometry)

$$\frac{d^n y}{dt^n} = u(t)$$

Area 2

(Notation  
invented by  
Leibniz)

What can  $n$  be?

Answer:

(In 1695, L'Hopital asked  
Leibniz, suppose  $n = \frac{1}{2}$ ?)

$n$  = integer = 1, 2, 3 4,

$n$  = negative integer = -1, -2, -3

$n$  can be a non integer,  $n = \frac{1}{2}, \frac{5}{6}$ .

$n$  can be a negative non integer,  $n = -.6, -3.4$ ,

$n$  can be irrational:

$$n = \sqrt{2}$$

$n$  can be a complex number:

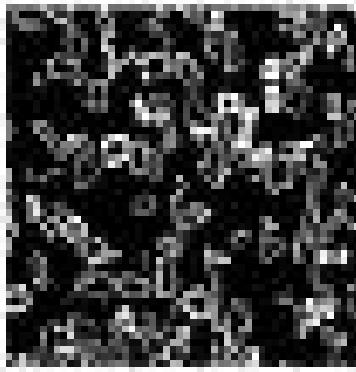
$$n = \sqrt{-1}$$

# Fractional Calculus – Main Points

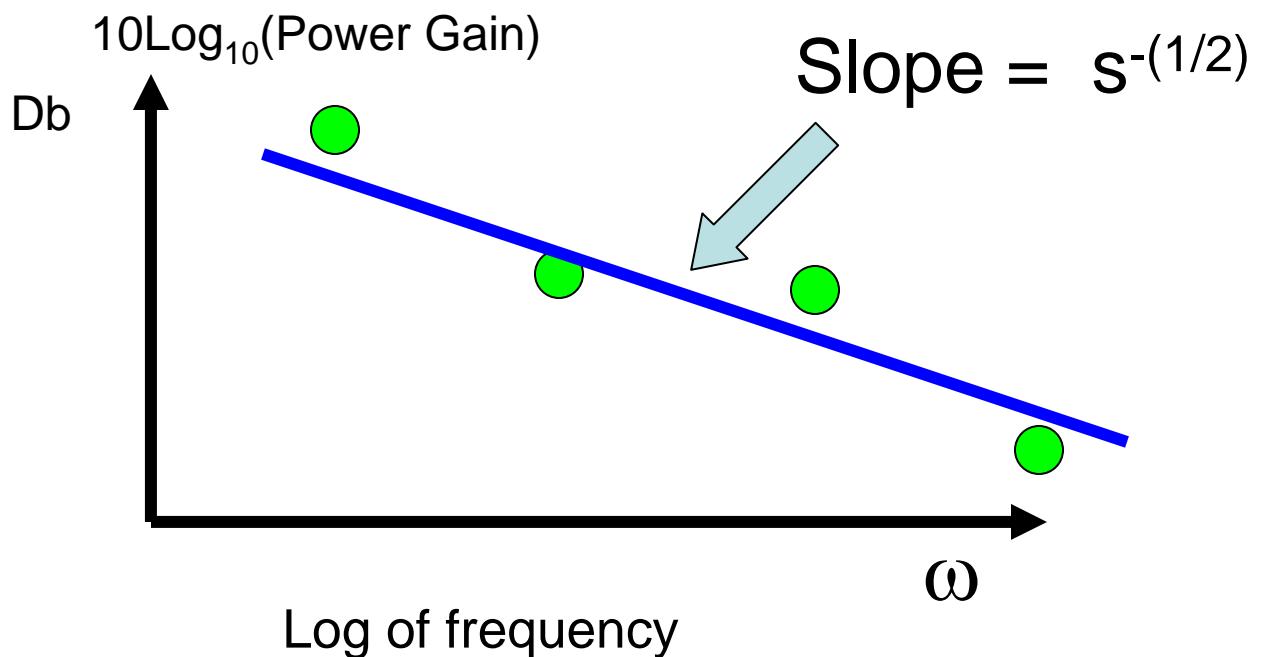
(non Euclidean geometry)

Area 2

## Why Study Fractional Calculus?



## Composite Materials



# Fractional Calculus –Main Points

Area 2

## Why use Fractional Calculus?

(1) It can deal with functions that are forever continuous and nowhere differentiable (fractals).

(2) It has the property of self similarity (scale invariance)

$$\frac{d^{5/2}(\alpha y)}{d(\alpha t)^{5/2}} + \frac{d^{3/2}(\alpha y)}{d(\alpha t)^{3/2}} + \frac{d^{1/2}(\alpha y)}{d(\alpha t)^{1/2}} = \frac{d^{3/2}(\alpha u)}{d(\alpha t)^{3/2}} + \frac{d^{1/2}(\alpha u)}{d(\alpha t)^{1/2}}$$

$$\frac{d^q f(bx)}{[dx]^q} = b^q \frac{d^q f(bx)}{[d(bx)]^q}$$

(3) It is also of the form:

$$z_{n+1} = f(z_n)$$

(Iterated function theory).

(4) It can also solve partial differential equations:

$$\frac{\partial^2 u(x, t)}{\partial x^2} = a^2 \frac{\partial u(x, t)}{\partial t}$$

# Fractional Calculus

Area 2

## An Easier Way to View the Self Similarity Property



A power law  $f(x) = x^a$  has the property that the relative change in

$$\frac{f(kx)}{f(x)} = k^a$$

### ***Is independent of x***

In this sense, the function lacks characteristic scale

(scale free or scale invariant). Let us evaluate  $\frac{f(kx)}{f(x)}$

Let  $x = y^a$

Then

$$\frac{f(kx)}{f(x)} = \frac{(ky)^a}{y^a} = k^a \frac{\cancel{y^a}}{\cancel{y^a}} = k^a$$

***Note: no dependence on x***

# Fractional Calculus –Main Points

(310 year old area). Non Euclidean

Area 2

## **Common Properties**

- (1) Scale Invariance – Self Similarity.

$$\frac{d^q f(bx)}{[dx]^q} = b^q \frac{d^q f(bx)}{[d(bx)]^q}$$

- (2) Weierstrass Function:

$$f(x) = \sum_{n=0}^{\infty} a^n \cos(b^n \pi x)$$

- (3) Solves Systems in Nature (Diffusion equation).

# Fractional Calculus –Other Points

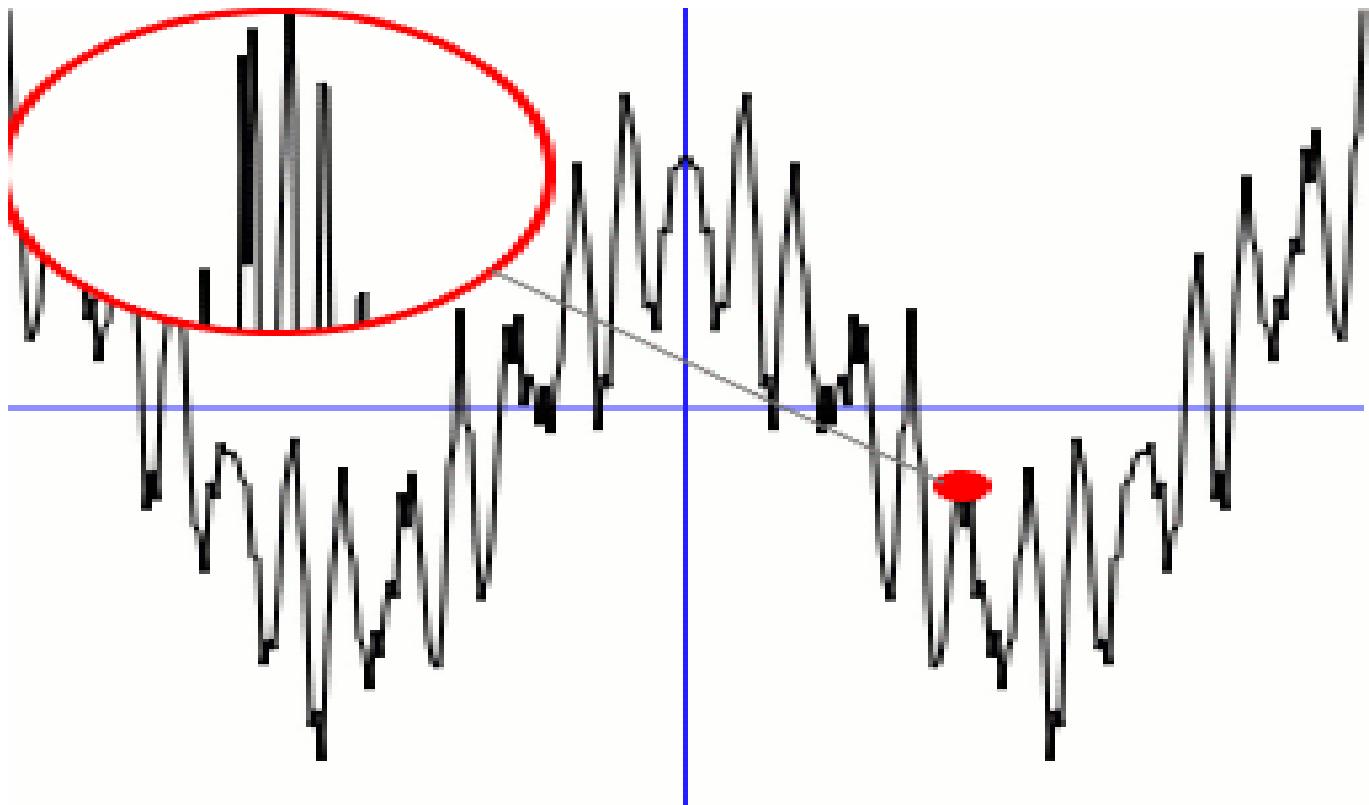
(310 year old area). Non Euclidean

Area 2

Forever continuous nowhere differentiable.

Weierstrass Function:  $f(x) = \sum_{n=0}^{\infty} a^n \cos(b^n \pi x)$

$0 < a < 1$ ,  $b$  is a positive integer and  $ab > 1 + (3/2)\pi$



Solves Systems in Nature (Diffusion equation).

# Fractional Calculus –Other Points

Weierstrass Function (Why?):

Area 2

$$f(x) = \sum_{n=0}^{\infty} a^n \cos(b^n \pi x)$$

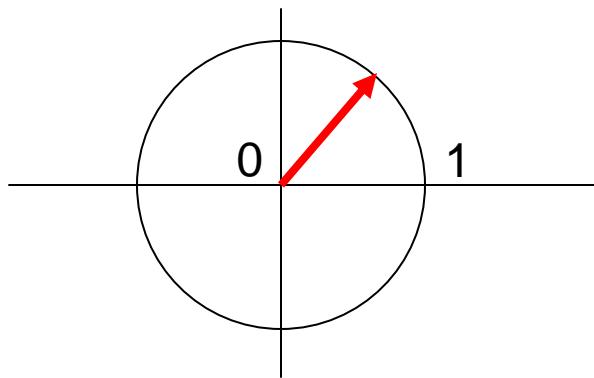
$0 < a < 1$ ,  $b$  is a positive integer and  $ab > 1 + (3/2)\pi$

Step 1: We understand the radius of convergence:

$$\frac{1}{1-x} = 1 + x + x^2 + x^3 + x^4 + x^5 + x^6 + \dots$$

$$\sum_{n=0}^{\infty} x^n = \frac{1}{1-x} = 1 + x + x^2 + x^3 + \dots$$

IFF  $|x| < 1$



# Fractional Calculus –Main Points

Area 2

(Solution of the Diffusion Equation)

$$\Gamma(z) = \int_0^\infty e^{-u} u^{z-1} du, \quad \Gamma(1) = 1, \Gamma(z+1) = z\Gamma(z),$$

Thus:  $\Gamma(z+1) = z!, \quad \Gamma(\frac{1}{2}) = \sqrt{\pi}$

---

Step 1 – Derivatives in  $x^m$

$$\frac{d}{dx} x^m = mx^{m-1}, \quad \frac{d^\beta}{dx^\beta} x^m = \frac{m!}{(m-\beta)!} x^{m-\beta} \quad \text{but } \beta \text{ may not be an integer}$$

$$\frac{d^\beta}{dx^\beta} x^m = \frac{\Gamma(m+1)}{\Gamma(m-\beta+1)} x^{m-\beta}, \quad \frac{d^{\frac{1}{2}}}{dx^{\frac{1}{2}}} x^1 = \frac{\Gamma(1+1)}{\Gamma(1-\frac{1}{2}+1)} x^{1-\frac{1}{2}} = \frac{2}{\sqrt{\pi}} x^{\frac{1}{2}}$$


---

This now **generalizes** for derivatives in  $e^{ax}$

$$D^\nu e^{ax} = a^\nu e^{ax}$$

( $\nu$  not an integer)

Generalizations to functions that can be written in a power series:

$$f_1(t) = \sum_{n=0}^q a_n + b_n x^n$$

Generalizations to functions that can be written in an exponential series:

$$f_2(t) = \sum_{n=0}^q a_n + b_n e^n \quad e^{i\theta} = \cos(\theta) + i \sin(\theta)$$

**Euler's Law:**

$$\cos(\theta) = \frac{e^{i\theta} + e^{-i\theta}}{2}$$

# Fractional Calculus –Main Points

(Solution of the Diffusion Equation)

Area 2

## Step 2 – Laplace Transform

$$F(s) = L[f(t)] = \int_0^\infty f(t)e^{-st}dt$$

Then: which holds if

$$e^{-\alpha t} |f(t)| \leq M < \infty$$

$$L^{-1}[F(s)] = f(t)$$

$$L^{-1}\left(\frac{1}{s^{1+\beta}}\right) = \frac{t^\beta}{\Gamma(\beta+1)}, \beta > -1$$

$$L^{-1}\left[\frac{1}{s^{\frac{1}{2}}}\right] = \frac{t^{\frac{-1}{2}}}{\Gamma\left(\frac{1}{2}\right)} = \frac{1}{(\sqrt{\pi})t^{\frac{1}{2}}}$$

## Step 3 - Diffusion Equation:

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t}$$

$$U(x,s) = L[u(x,t)] = \int_0^\infty e^{-st} u(x,t) dt$$

$$L\left[\frac{\partial u}{\partial t} - \frac{1}{a^2} \frac{\partial^2 u}{\partial x^2}\right] = sU(x,s) - f(x) - \frac{1}{a^2} \frac{\partial^2 U}{\partial x^2} = 0$$

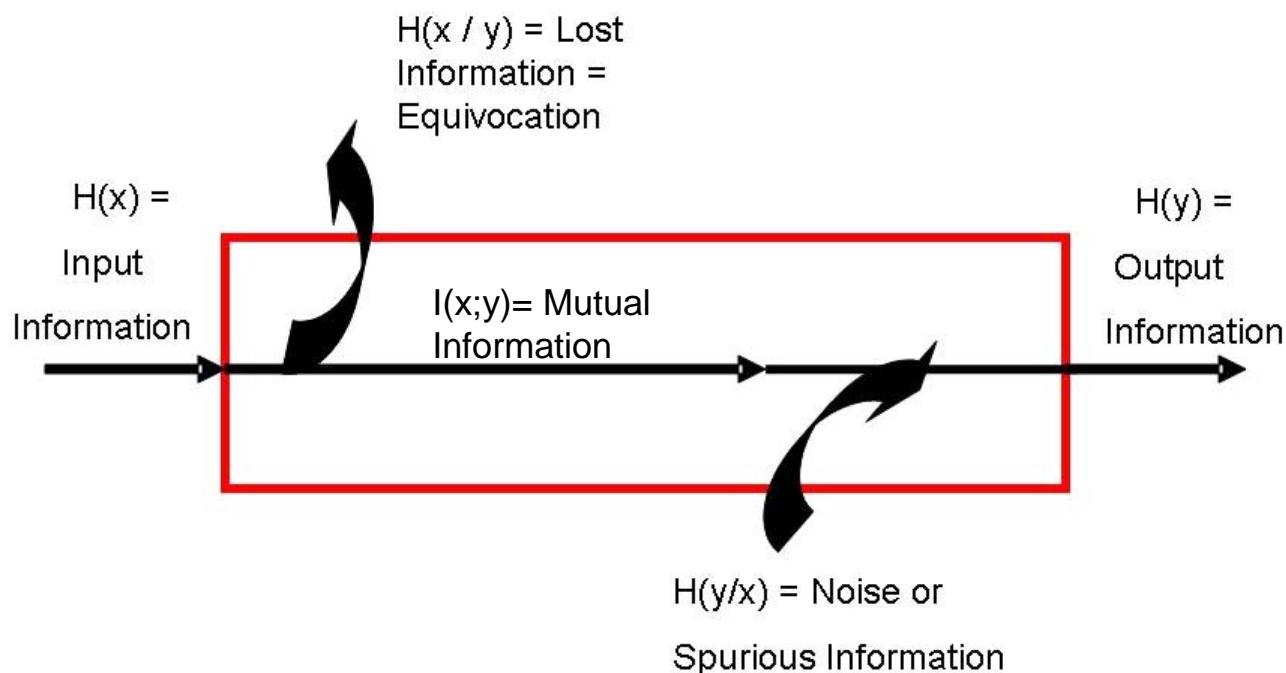
$$U(x,s) = Ae^{xas^{\frac{1}{2}}} + Be^{-axs^{\frac{1}{2}}} = \frac{1}{a^2 2\sqrt{s}} \int_{-\infty}^{\infty} e^{-\sqrt{s}|x-\tau|} f(\tau) d\tau$$

$$u(x,t) = \frac{1}{2\sqrt{\pi t}} \int_{-\infty}^{\infty} e^{-\frac{-(x-\tau)^2}{4t}} f(\tau) d\tau$$

# Part 1-B- Background Material

## Information Theory

Area 3



$$D_R = H(x/y) + H(y/x) \quad (\text{metric not a measure})$$

$\rho(x,y) \geq 0$  for all  $x$  and  $y$ . (non negativity)

$\rho(x,y) = \rho(y,x)$  (symmetry)

$\rho(x,z) \leq \rho(x,y) + \rho(y,z)$  (triangular inequality)

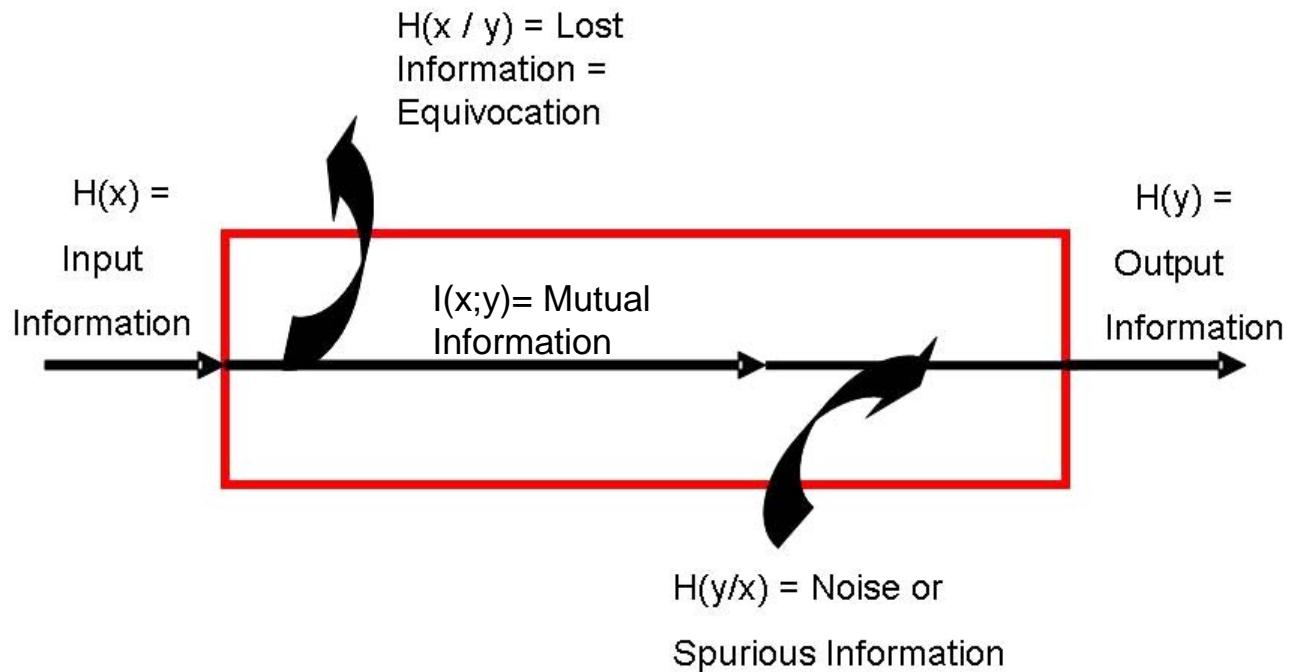
$\rho(x,y) = 0$  IFF  $x=y$  (identity of indiscernibles)

Mutual Information ( $I(x,y)$ ) is well embraced by numerous disciplines. (MI is the **reduction in uncertainty in an input object by observing an output object**).

# Part 1-B- Background Material

## Information Theory

Area 3



## Why are we interested in flow rate?

Units of  $I(x;y)$  are bits/sec

Therefore bits =  $I(x;y) \Delta t$  where

$\Delta t$  = time to complete a task.

Suppose we view bits as discrete events.

$$\Delta t = \frac{\text{events}}{I(x; y)}$$

If bits = events = fixed then:

$\min I(x;y) \Rightarrow \max \Delta t$ ,  $\max I(x;y) \Rightarrow \min \Delta t$

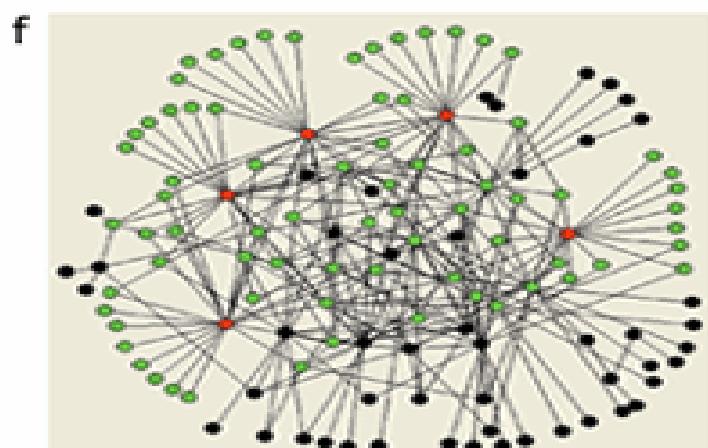
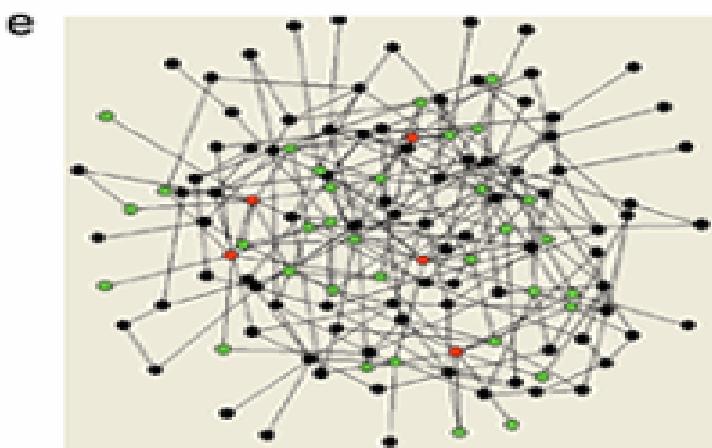
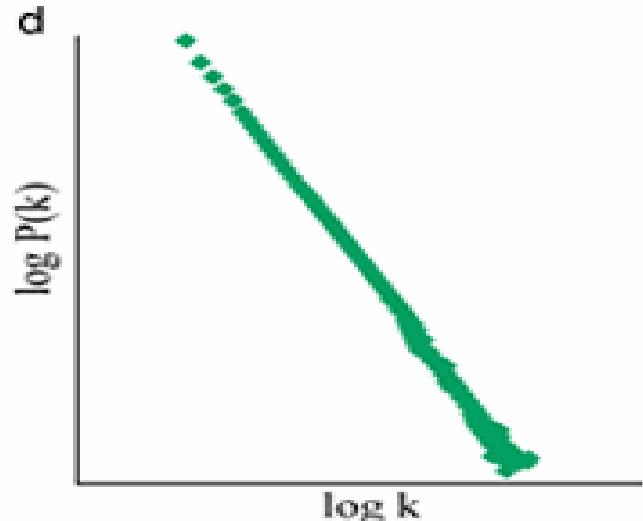
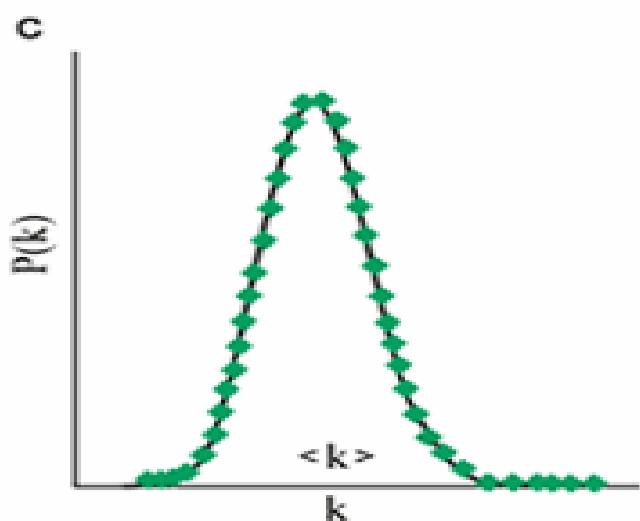
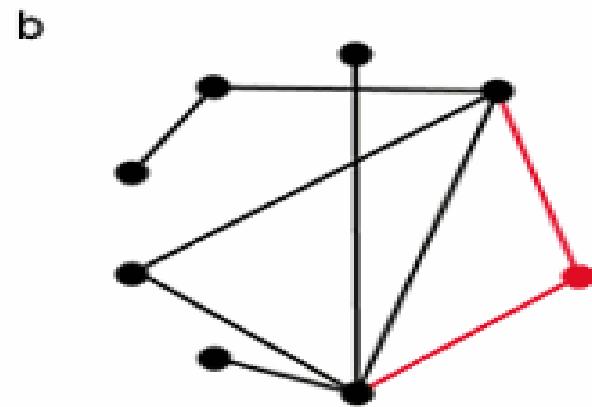
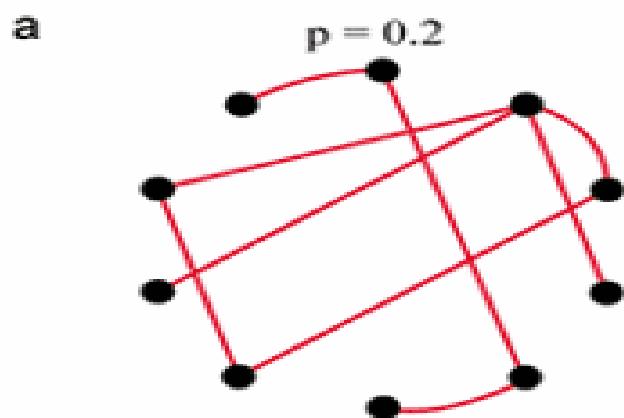
*Optimal Performance*

*Optimal Network Attack*

# Part 1-B- Background Material-Graph Theory

Area 4

- (1) Random Graphs. (Less vulnerable, uniformly connected).
- (2) Scale free graphs. (Highly vulnerable, not uniformly connected).

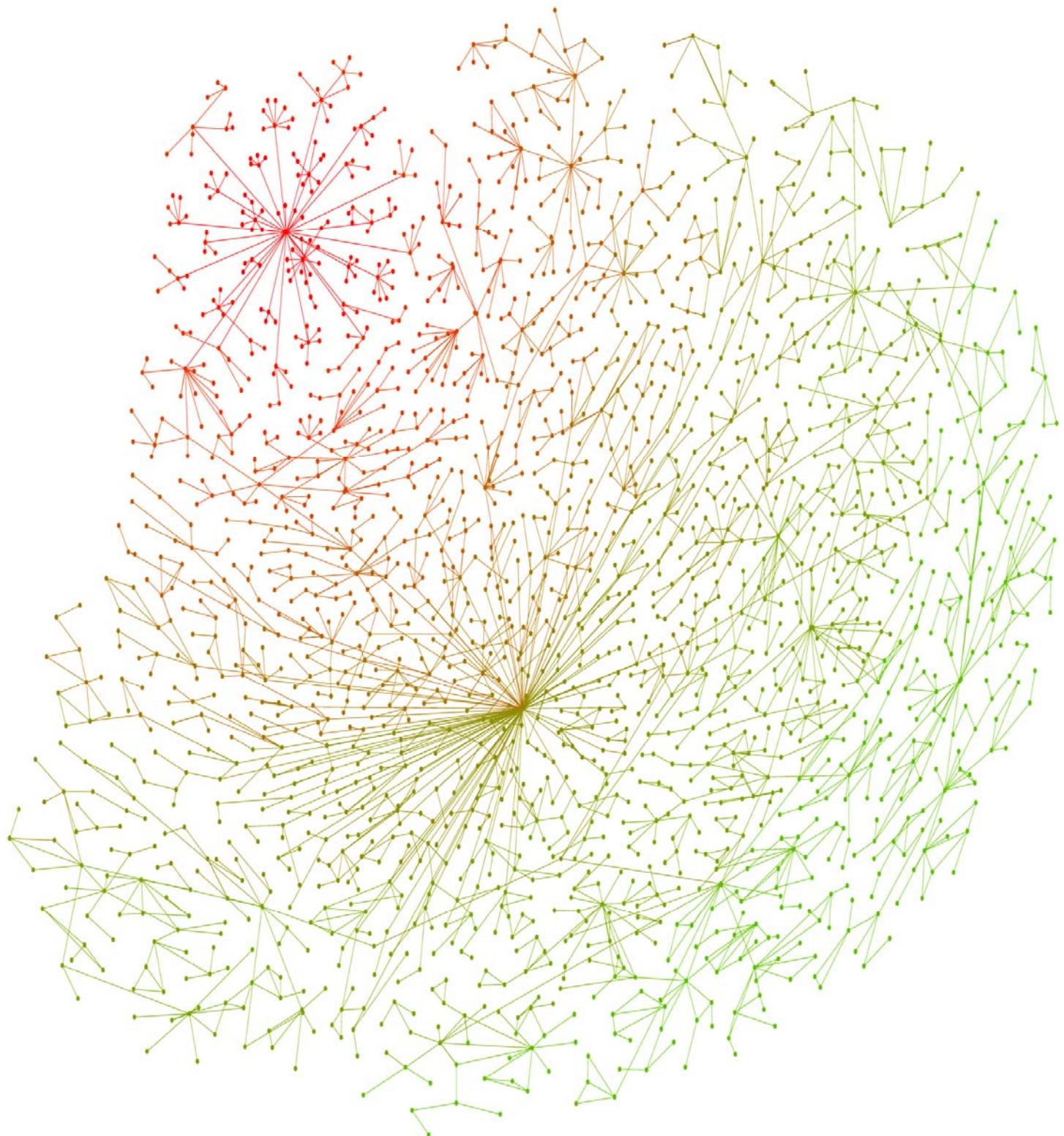


# Part 1-B- Background Material

## Graph Theory (Spatial Construct)

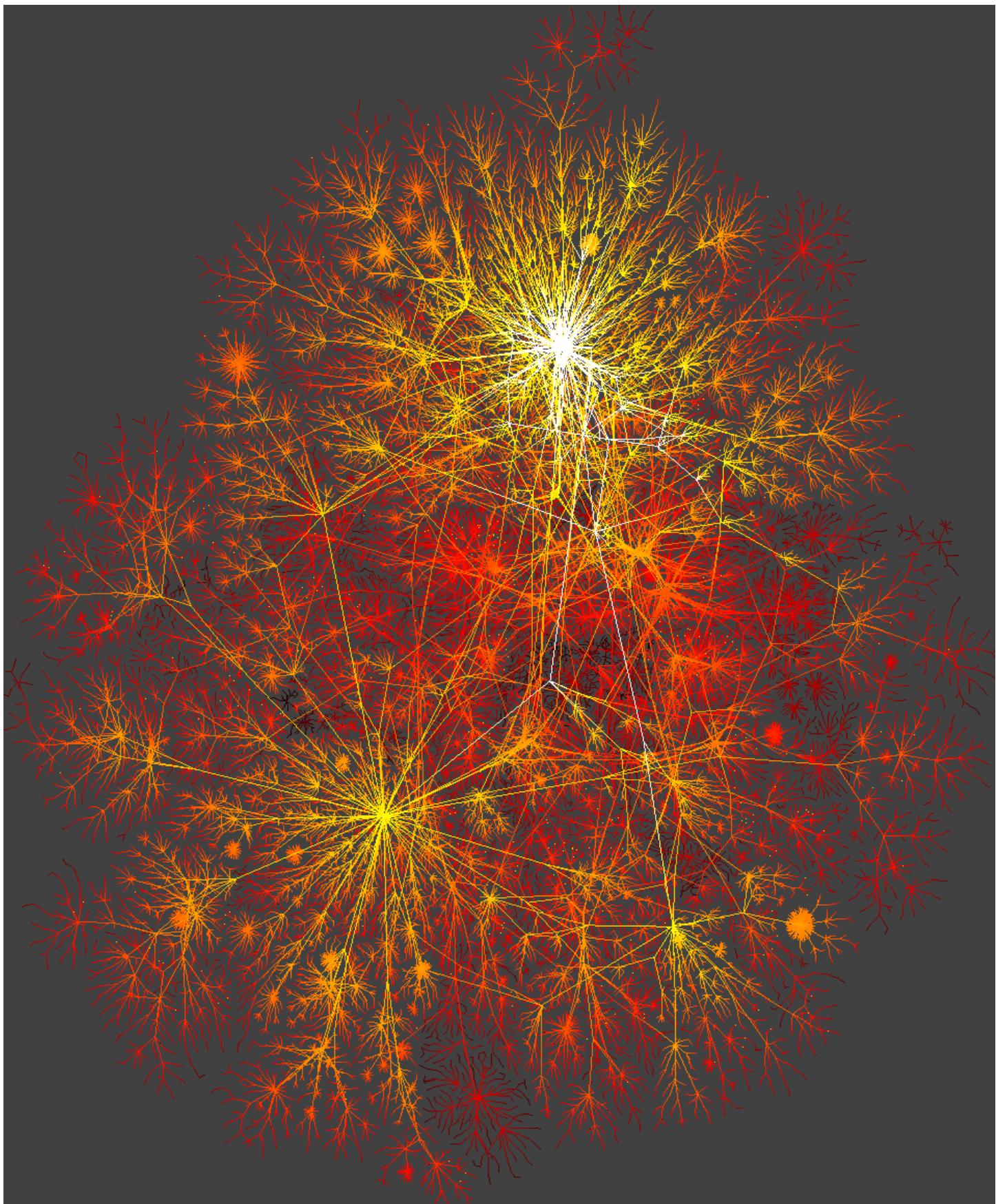
Area 4

The Internet



# Internet-Map

Area 4

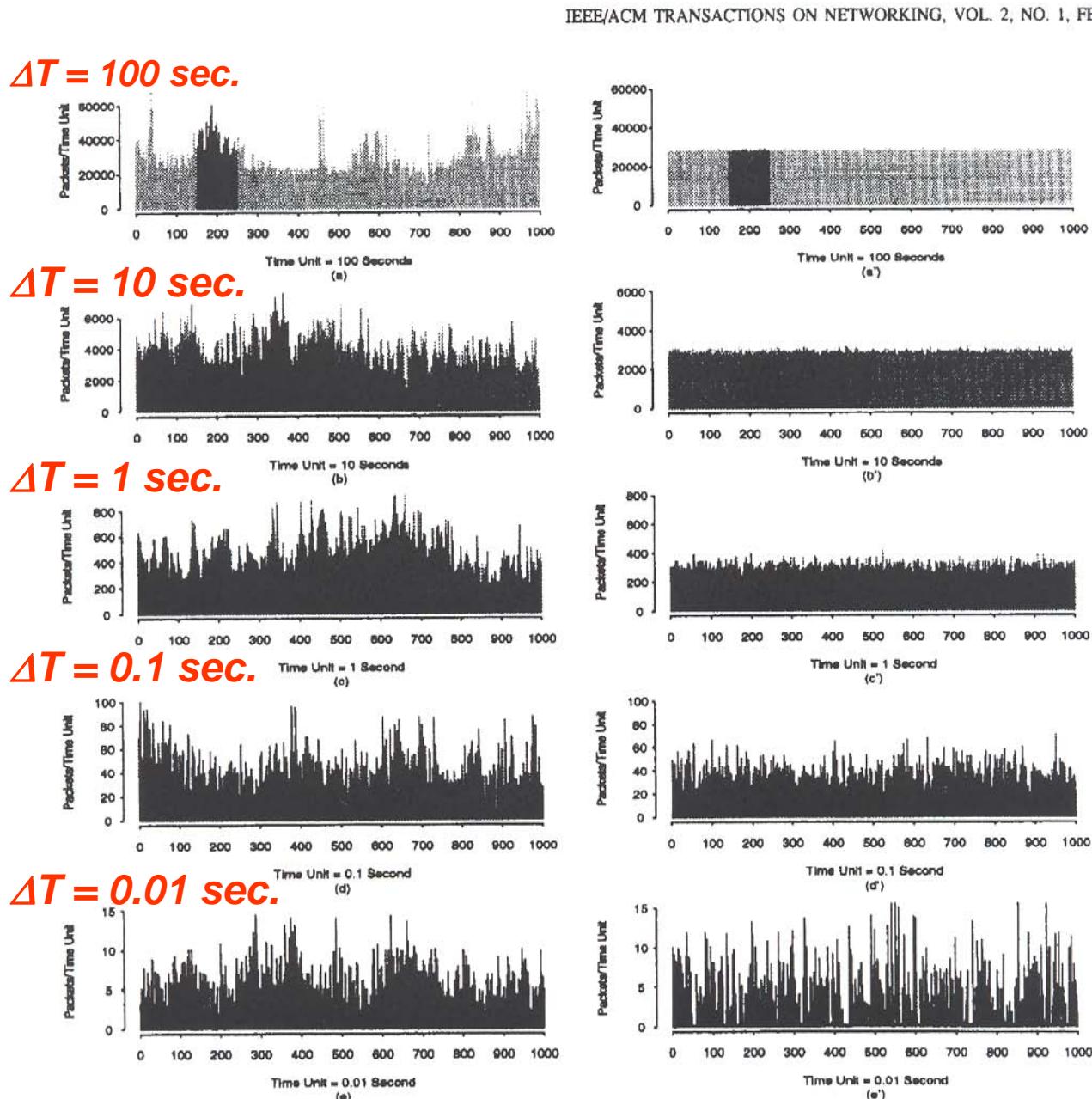


# Part 1-B - Background Material

## Graph Theory *(Spatial and Temporal)*

Area 4

The Internet is **dynamically** scale free (evidence) :



Reference: W. E. Leland, et al., *IEEE/ACM Trans. on Networking*, vol 2, no. 1, Feb. 1994, "On the Self-Similar Nature of Ethernet Traffic (Extended Version)."

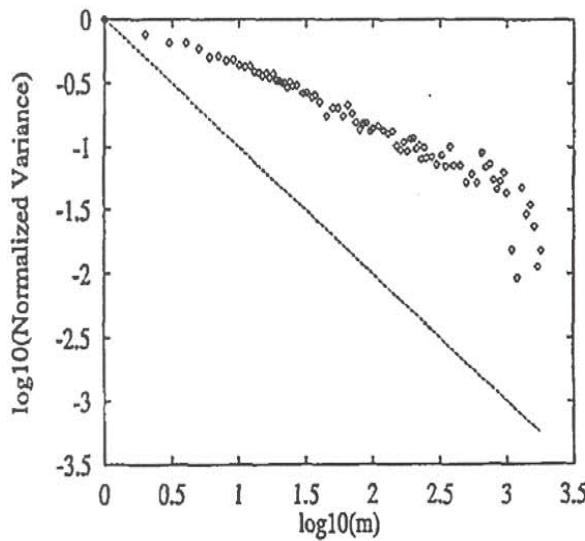
# Part 1-B - Background Material

## Graph Theory

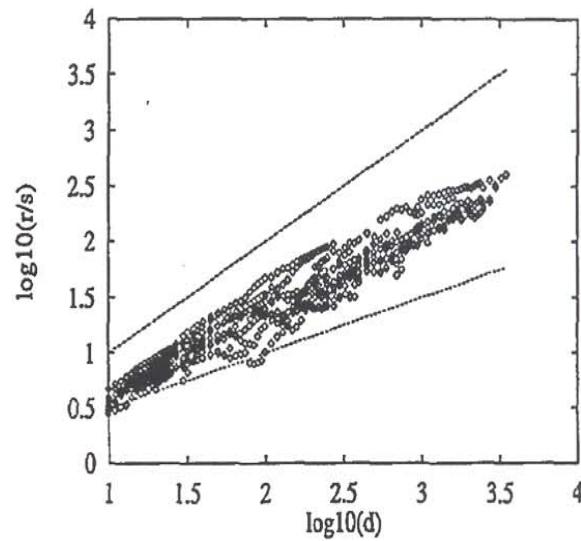
Area 4

The Internet is dynamically scale free (evidence) :

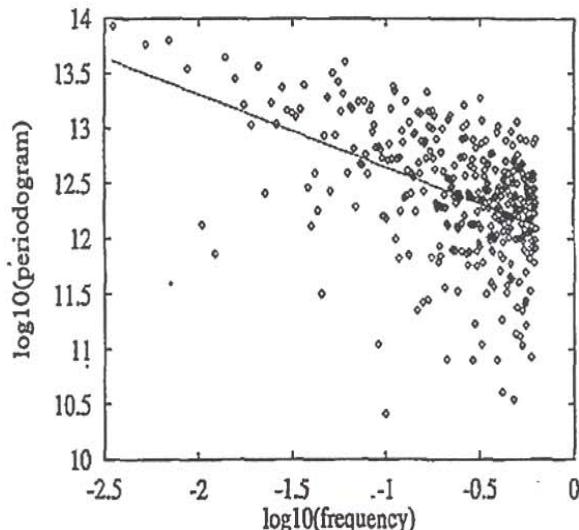
CROVELLA AND BESTAVROS: SELF-SIMILARITY IN WWW TRAFFIC



(a)



(b)



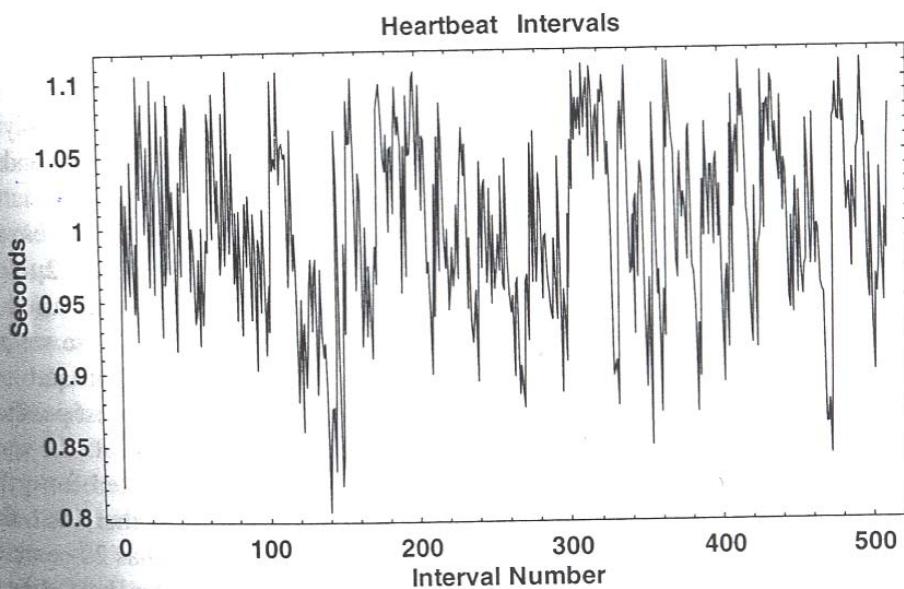
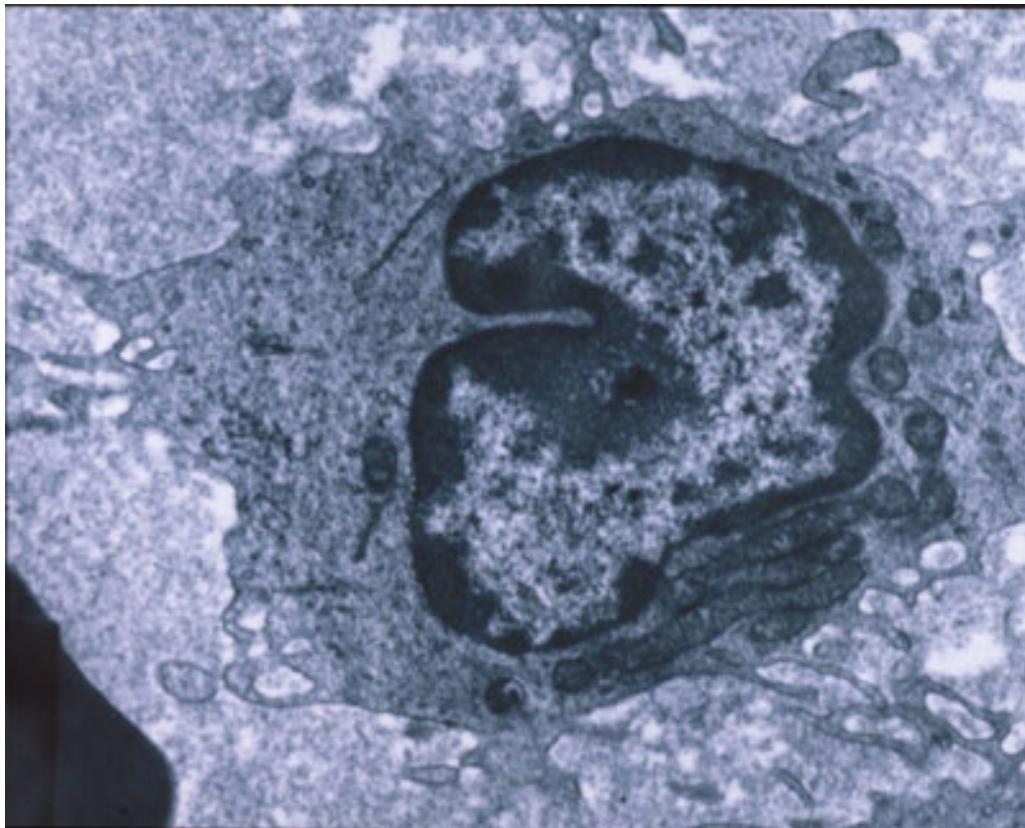
(c)

Fig. 1 Graphical analysis of a single hour.

**Reference:** M. Crovella and A. Bestavous, "Self-Similarity in World Wide Web Traffic: Evidence and Possible Causes," *IEEE/ACM Trans. On Networking*, Vol. 5, no. 6, December, 1997.

# Other Physiological Evidence

Area 4



Heartbeat  
intervals

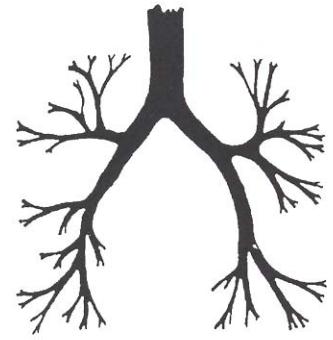
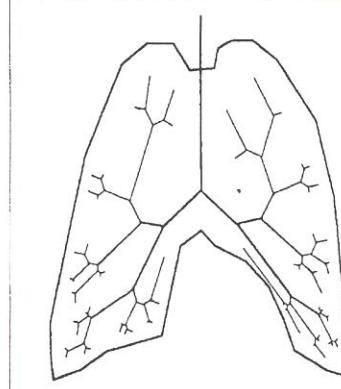
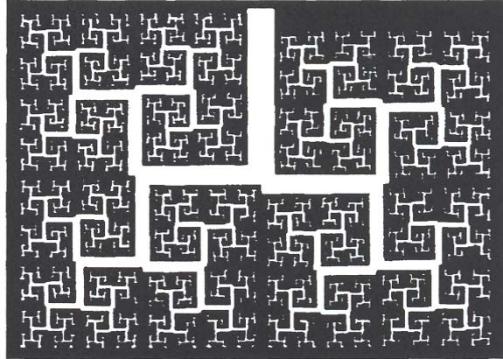
**Figure 2.** The time series of heartbeat intervals of a healthy young adult male is shown. It is clear that the variation in the time interval between beats is relatively modest, but certainly not negligible.

**Reference:** B. J. West, "Fractal Physiology, Complexity, and the Fractional Calculus," Chapter 6, in "Fractals, Diffusion and Relaxation in Disordered Complex Systems," in *Advances in Chemical Physics*, vol 133, part B, John Wiley, 2006, Eds. W. T. Coffey and Y. P. Kalmykov.

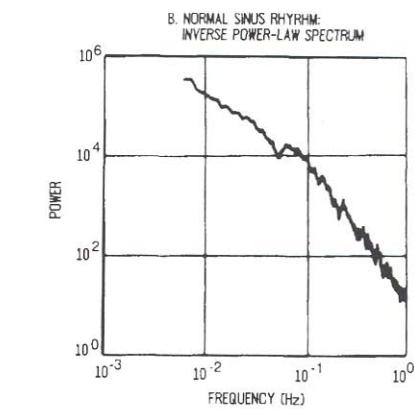
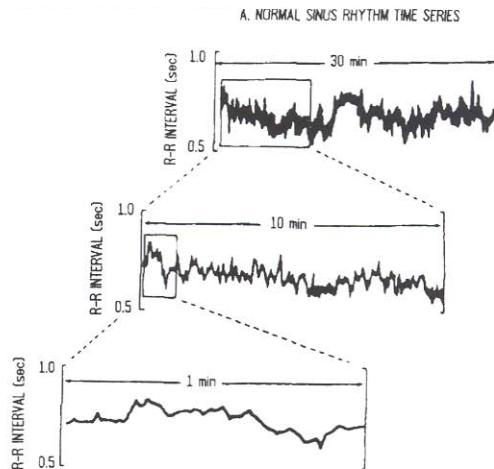
# Other Physiological Evidence

Area 4

(2/3)  $L(U)$ , and as  $z \rightarrow \infty$ , the length of the Cantor set exponentially goes to zero. PHASE THE SUGGESTED SCHEMATICITY



4. Computer simulation of a fractal lung, in which the boundary conditions influence morphogenesis. The boundary was derived from a chest radiograph. The model data are in good agreement with actual structural data [9].



## Sinus Rhythm Intervals

### Reference:

W. Deering and B. J. West, "Fractal Physiology," *IEEE Eng. In Medicine and Biology*, June, 1992.

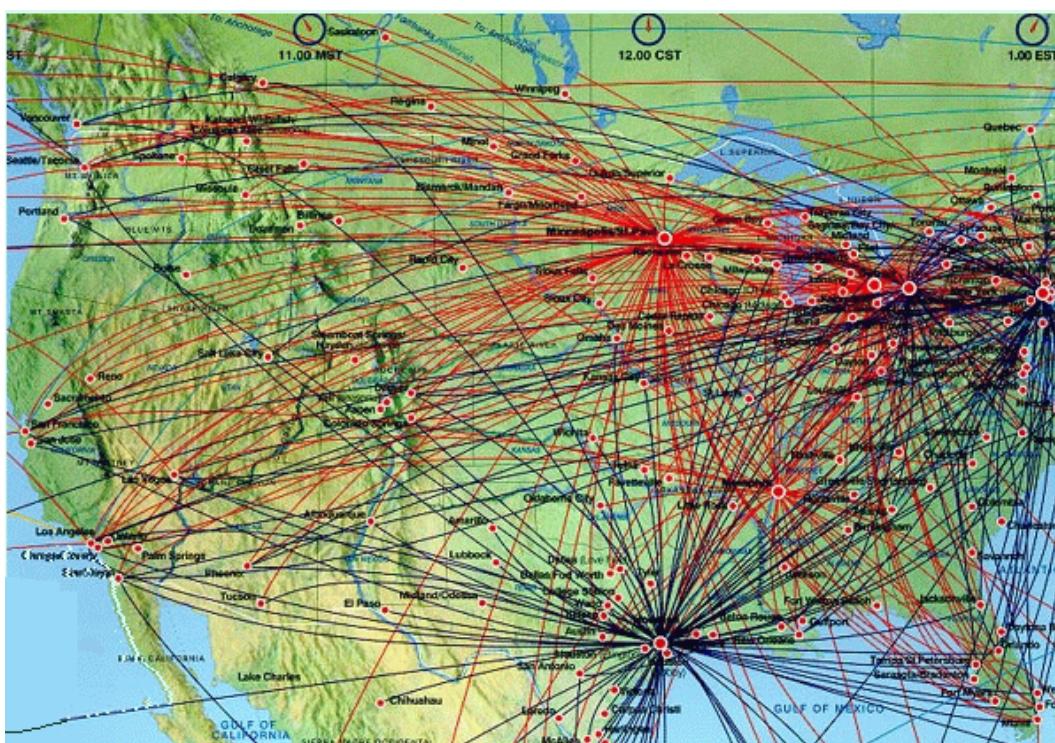
Additional Background Material – H. Jeong – Complex ‘07  
(The difference between random and scale-free graphs)

# Highway network

Area 4



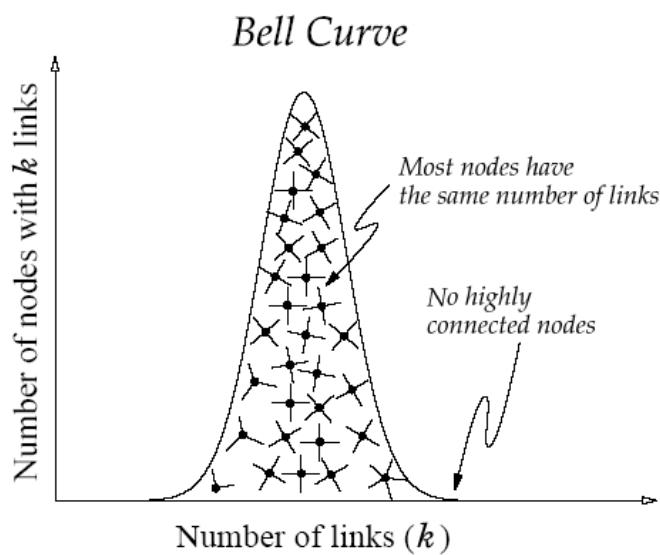
# Airline network



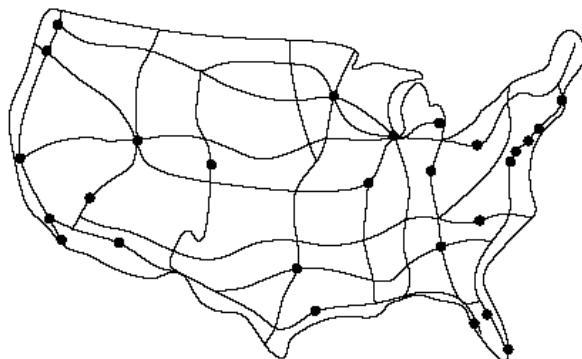
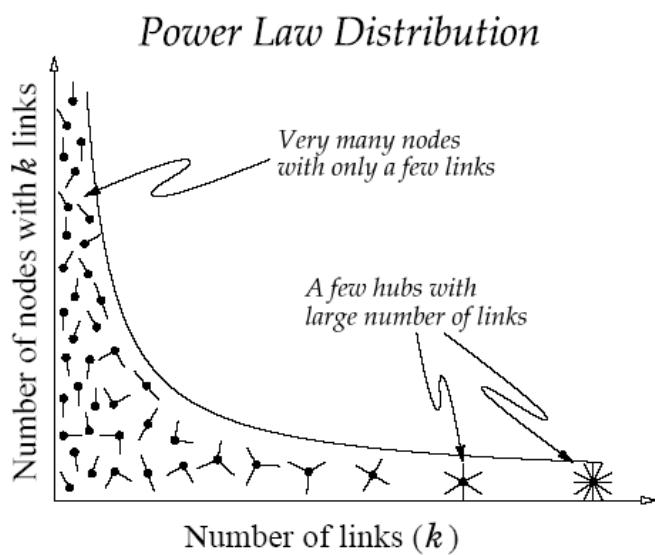
# Mathematically? via Degree distribution $P(k)$

Area 4

## Random



## Scale Free

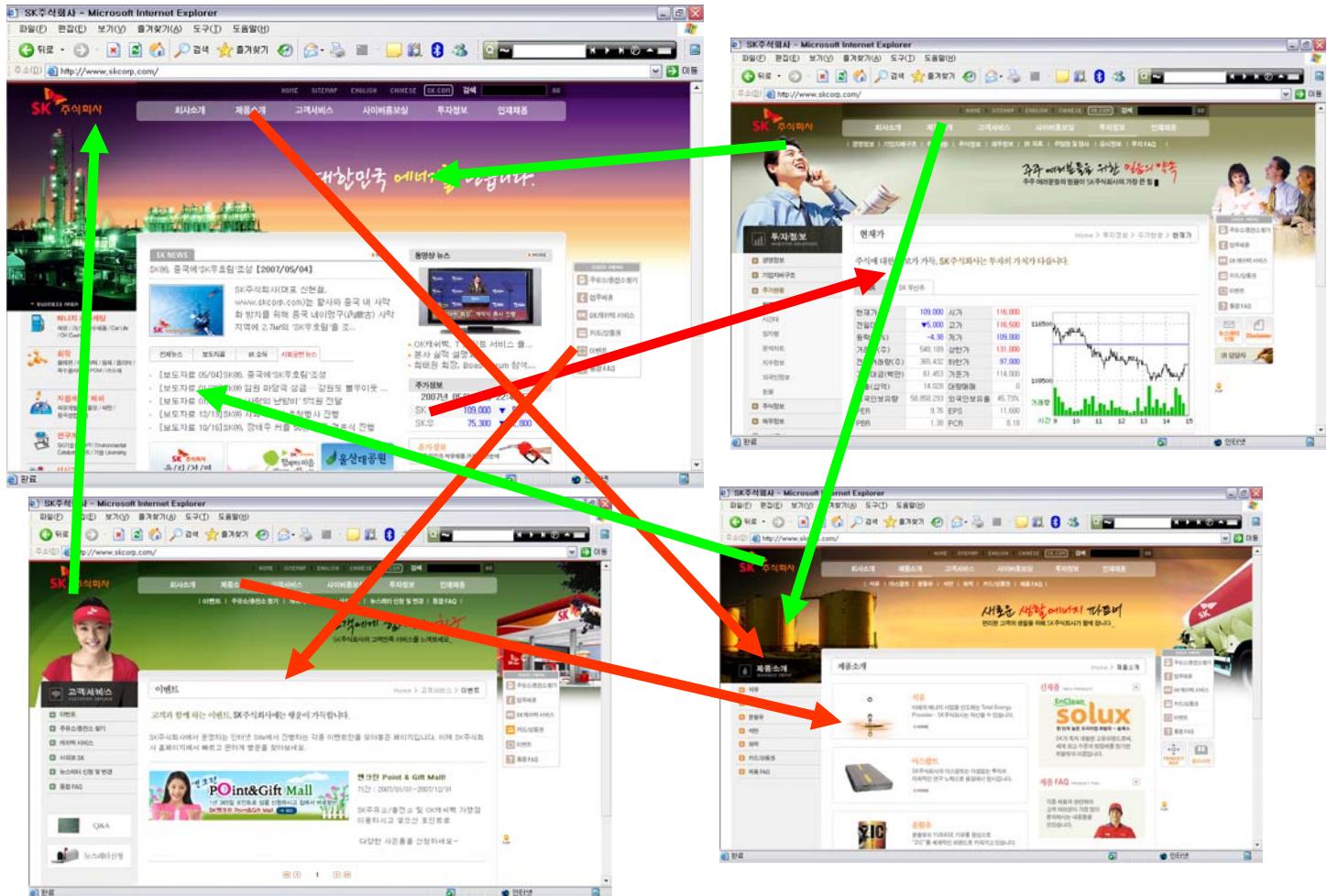


# World Wide Web

## Node(point): web-page

Area 4

link(line): hyper-link



The problem is to discern (for each application):

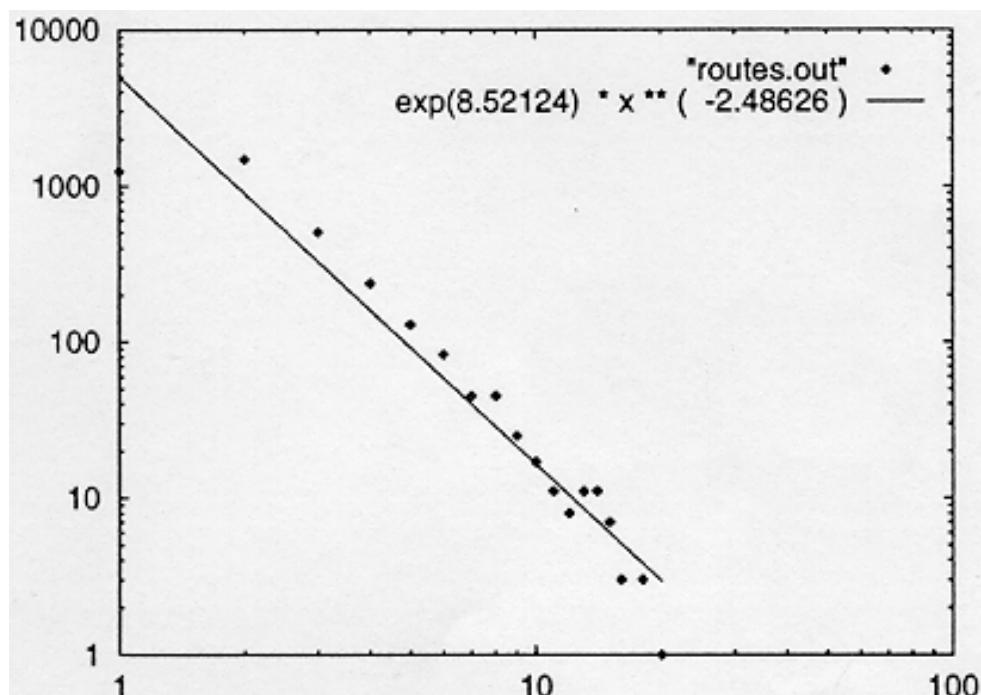
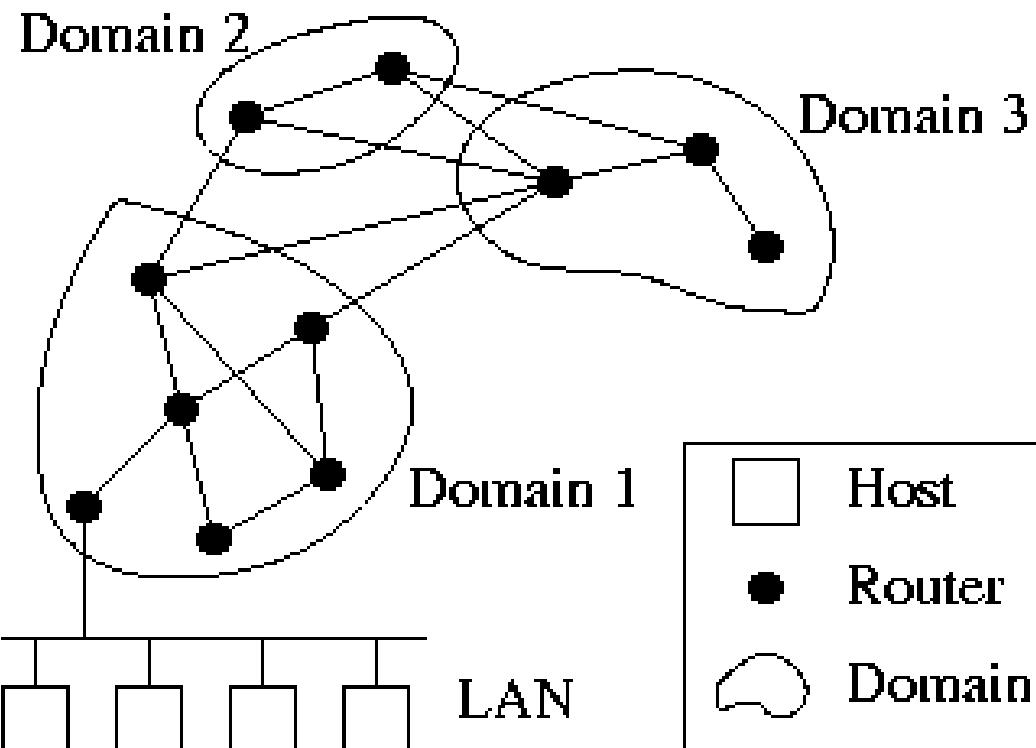
- (1) What are the nodes?
- (2) What are the links?

# INTERNET BACKBONE

Nodes: computers, routers

Area 4

Links: physical lines



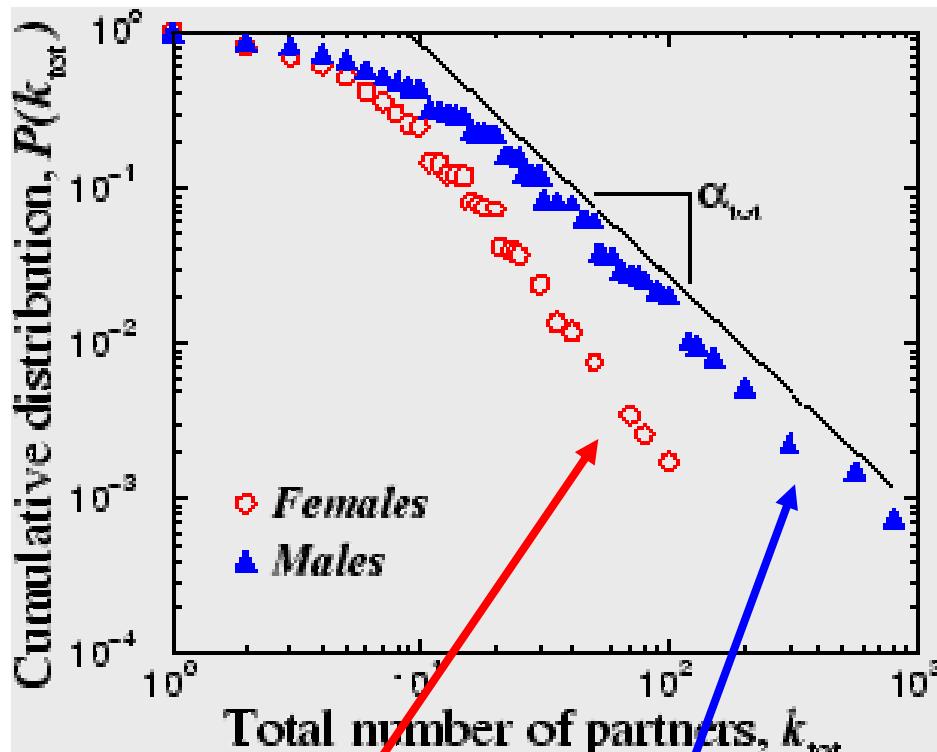
(Faloutsos, Faloutsos and Faloutsos, 1999)

# SEX-Web

**Nodes:** people (females; males)

Area 4

**Links:** sexual relationships



Female hub :  
 $k \sim 100$

Male hub :  
 $k \sim 1000$

(Liljeros et al. Nature 2001)



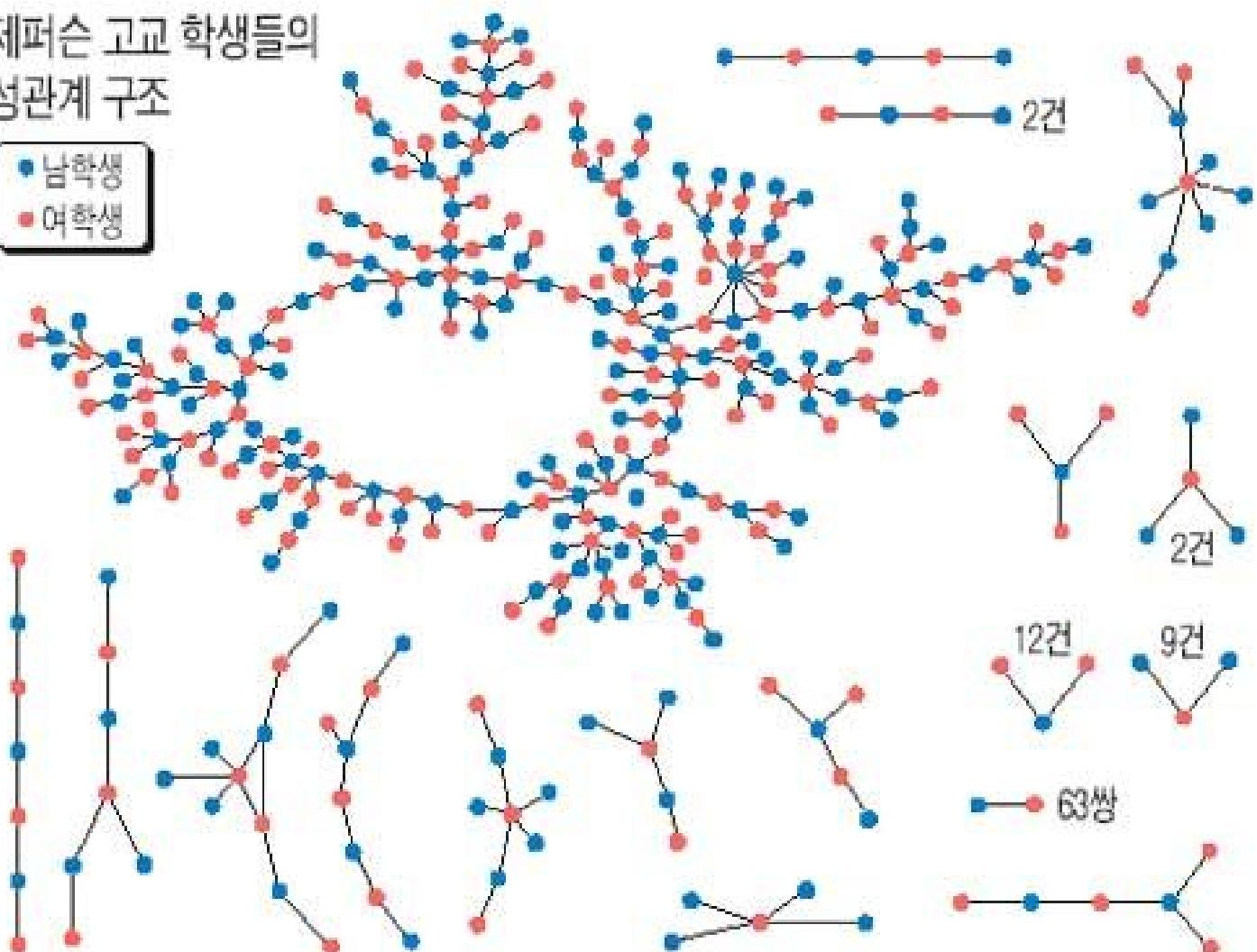
# Sexual Relationships in Jefferson High School

- Male
- Female

Area 4

제퍼슨 고교 학생들의  
성관계 구조

- 남학생
- 여학생

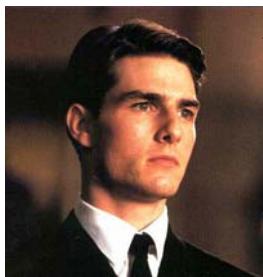


# ACTOR CONNECTIVITIES

Nodes: actors

Links: cast jointly

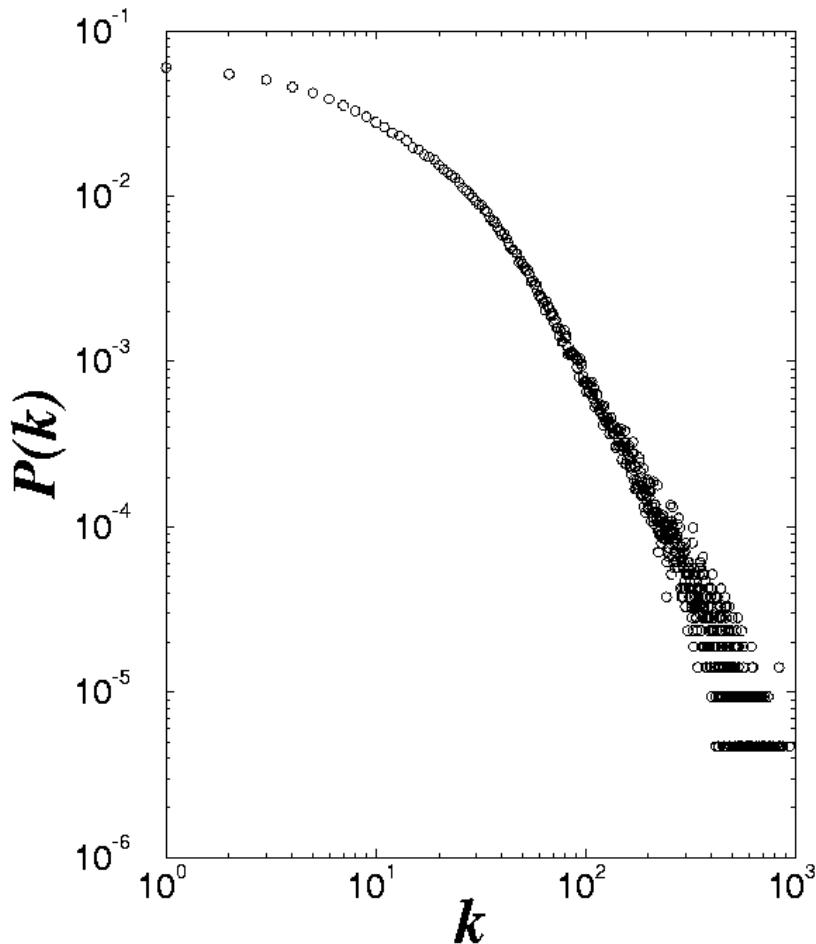
Area 4



Days of Thunder (1990)  
Far and Away (1992)  
Eyes Wide Shut (1999)

$N = 212,250$  actors     $\langle k \rangle = 28.78$

$P(k) \sim k^{-\gamma}$ ,     $\gamma=2.3$



# SCIENCE CITATION INDEX

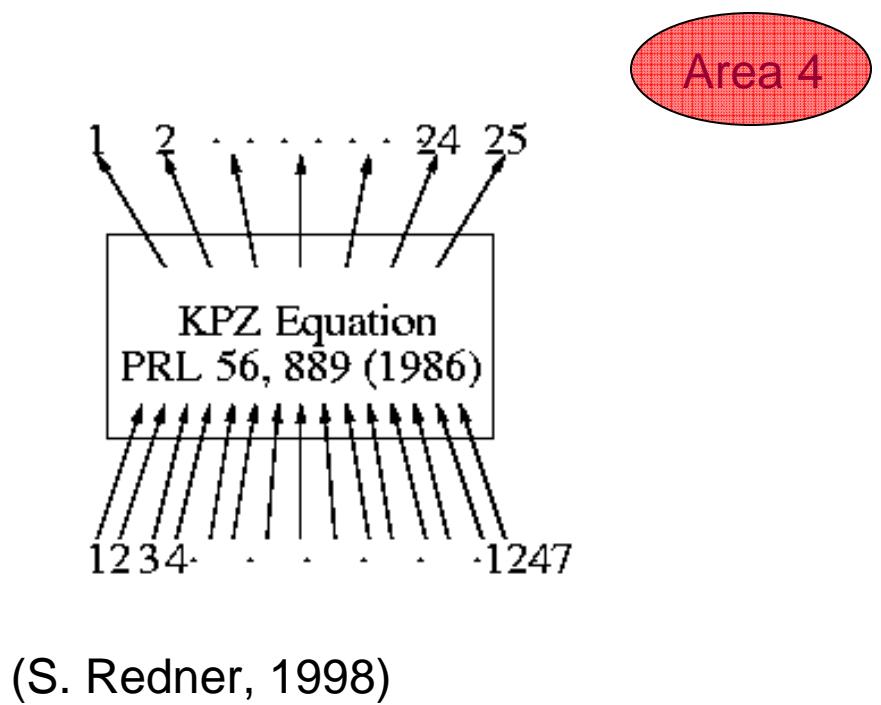
Nodes: papers

Links: citations

1736 PRL papers (1988)

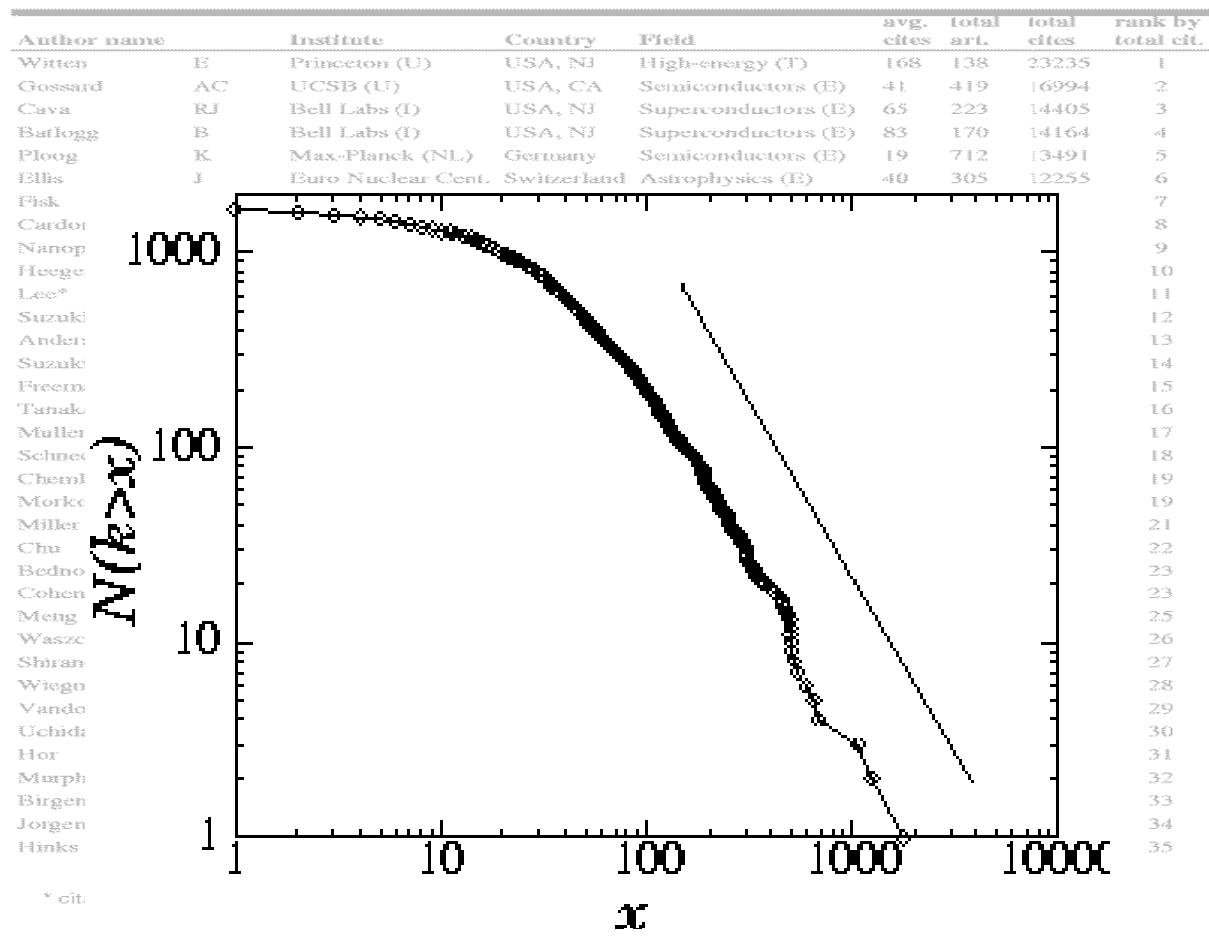
$$P(k) \sim k^{-\gamma}$$

$$(\gamma = 3)$$



(S. Redner, 1998)

1,000 Most Cited Physicists, 1981-June 1997  
Out of over 500,000 Examined  
(see <http://www.sst.nrel.gov>)



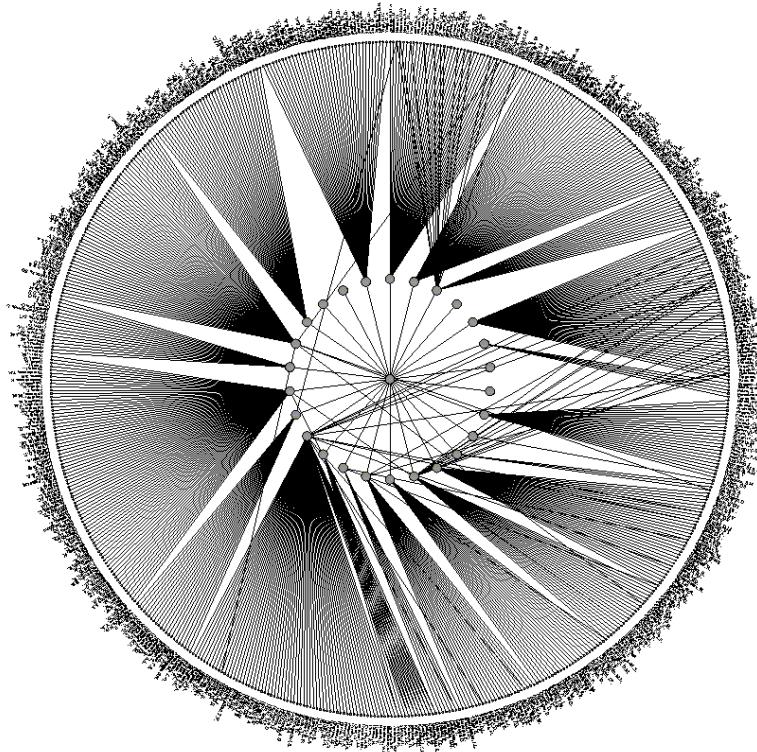
# SCIENCE COAUTHORSHIP

## (collaboration network)

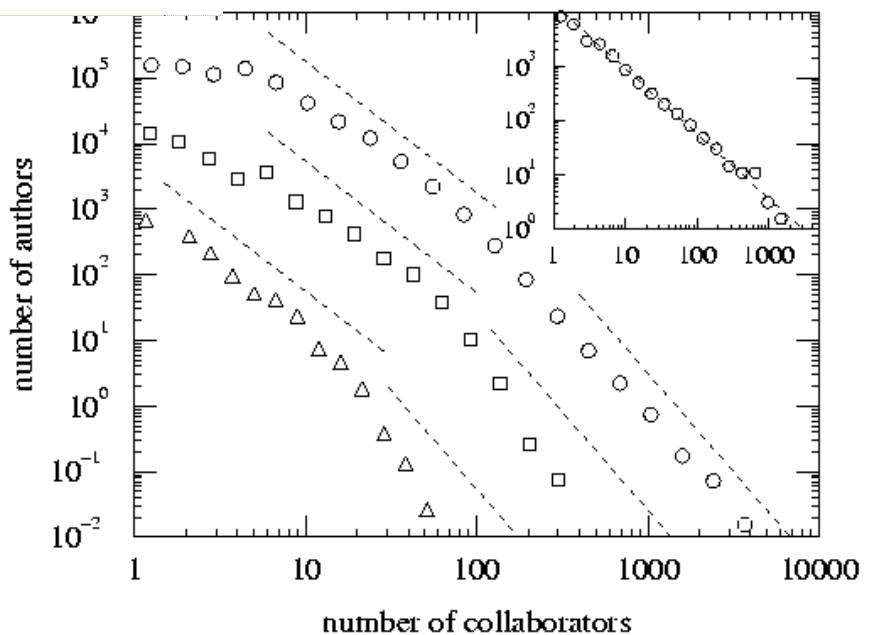
Area 4

Nodes: scientist (authors)

Links: write paper together



(Newman, 2000,  
H. Jeong et al 2001)



# Other Examples of Scale-Free Networks

## Email network

Area 4

Nodes: individual email address

Links: email communication

## Phone-call networks

Nodes: phone-number

Links: completed phone call

(Abello et al, 1999)

## Networks in linguistics

Nodes: words

Links: appear next or one word apart from each other

(Ferrer et al, 2001)

## Networks in Electronic auction (eBay)

Nodes: agents, individuals

Links: bids for the same item

(H. Jeong et al, 2001)

# THEN WHY??

Area 4

(i) Efficiency of resource usage.

**Diameter (Scale-free) < Diameter (Exponential)**

(\* Diameter ~ average path length between two nodes)

(ii) Robustness of complex networks.

**Scale-free networks are more robust under random errors, but very vulnerable under intentional attacks!**

**Scale-free Networks are efficient/robust.**

Points:

(1) Vulnerability ( $[robustness]^{-1}$ ) is predicated on:

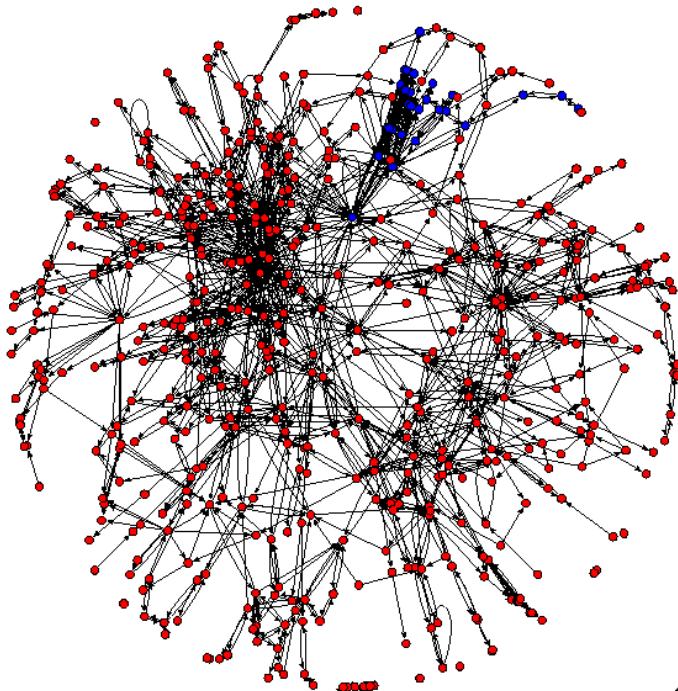
(a) Architecture of network

(b) Type of attack.

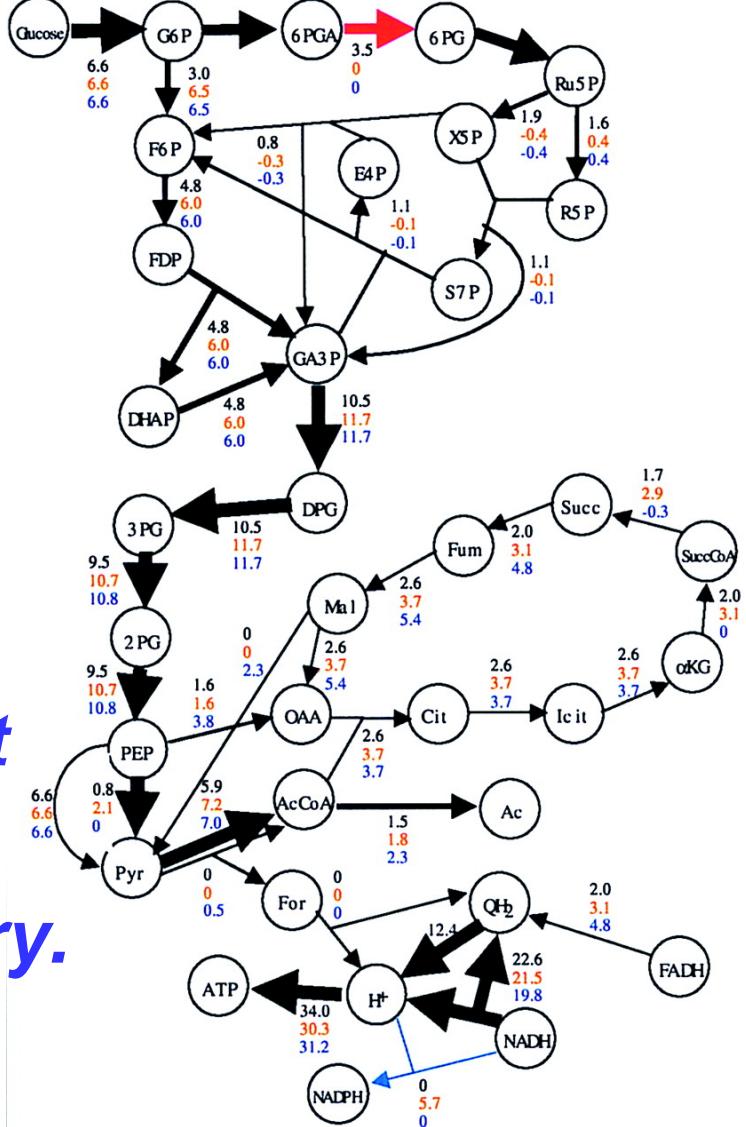
# What is the Real Problem?

Area 4

Most networks are not static, they're dynamic!



e.g. real metabolic  
networks are DYNAMIC!!

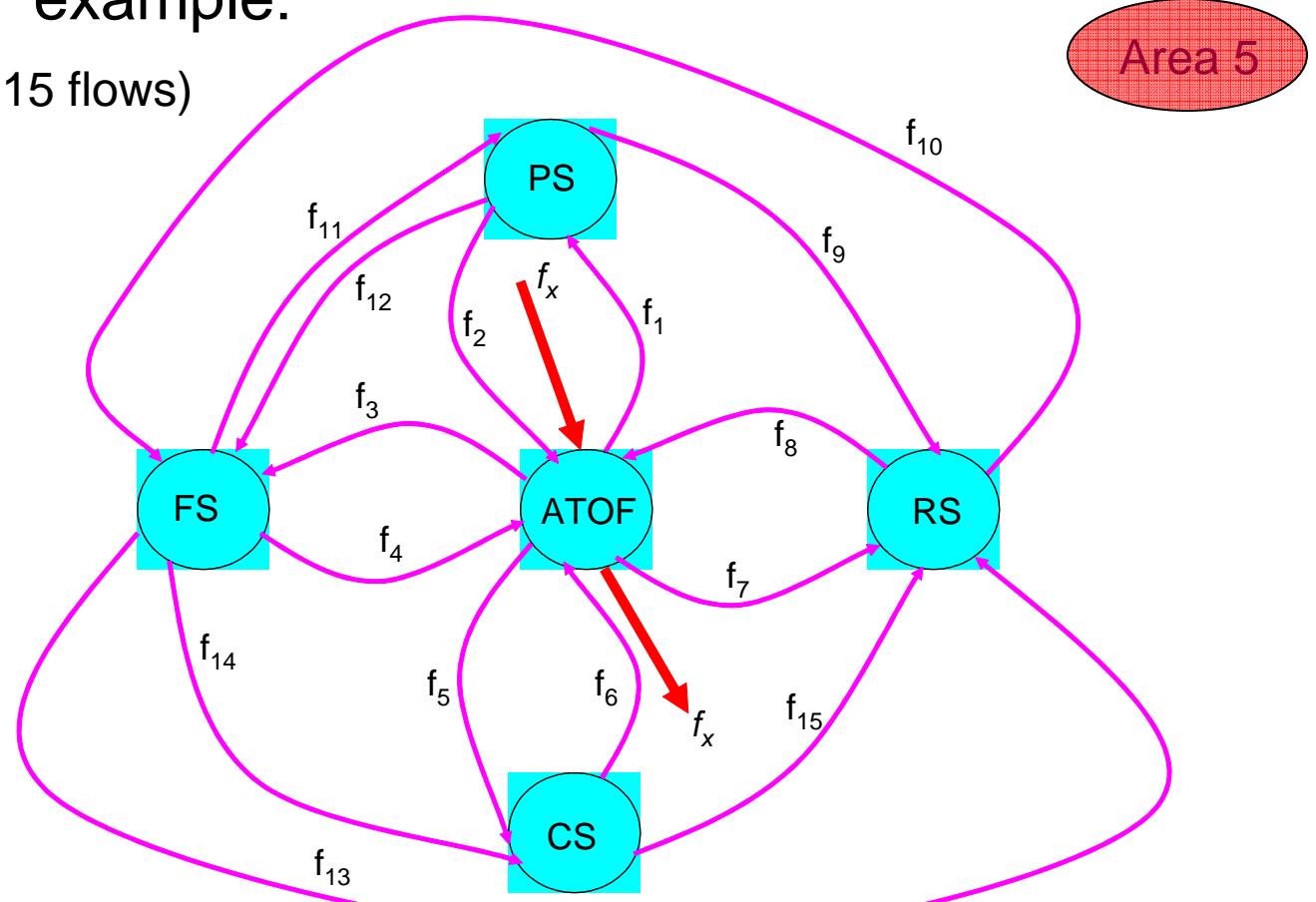


Let us stop with  
*Graph Theory and*  
*move on to the last*  
*area*

*Optimization Theory.*

## Part 1-C – Let us work a practical example:

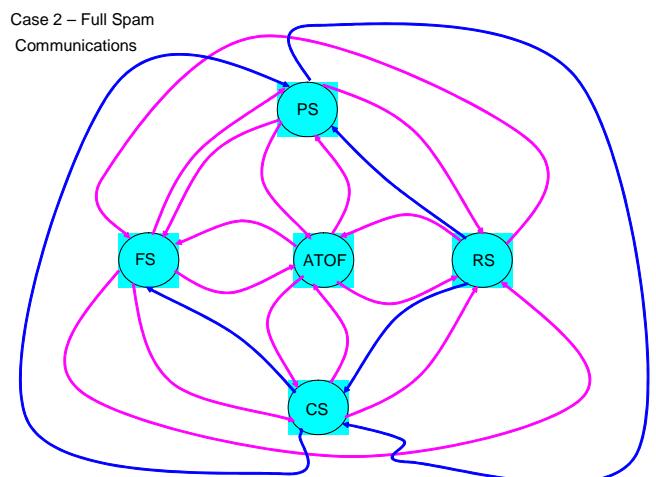
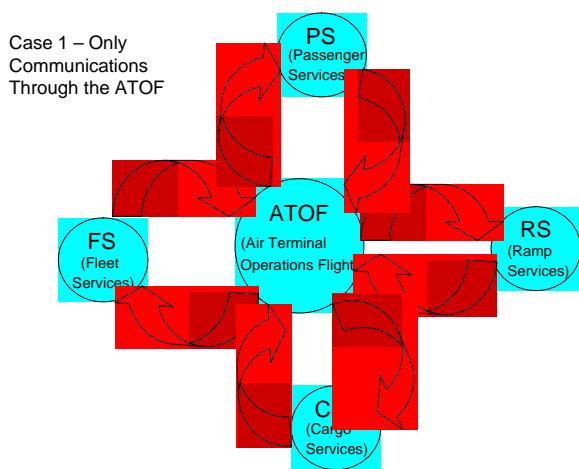
(15 flows)



### ***Structure For the CAPS Simulation using GAs***

Minimum (8 links)

Maximum (20 links)

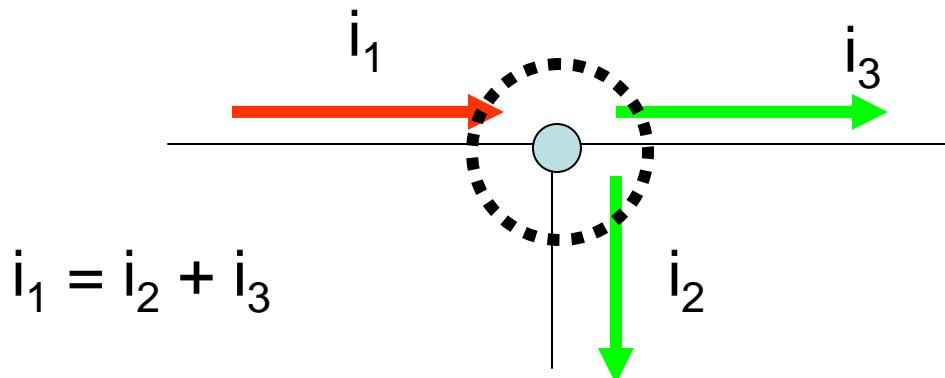


# Part 1-C – Issues of Vulnerability and Performance

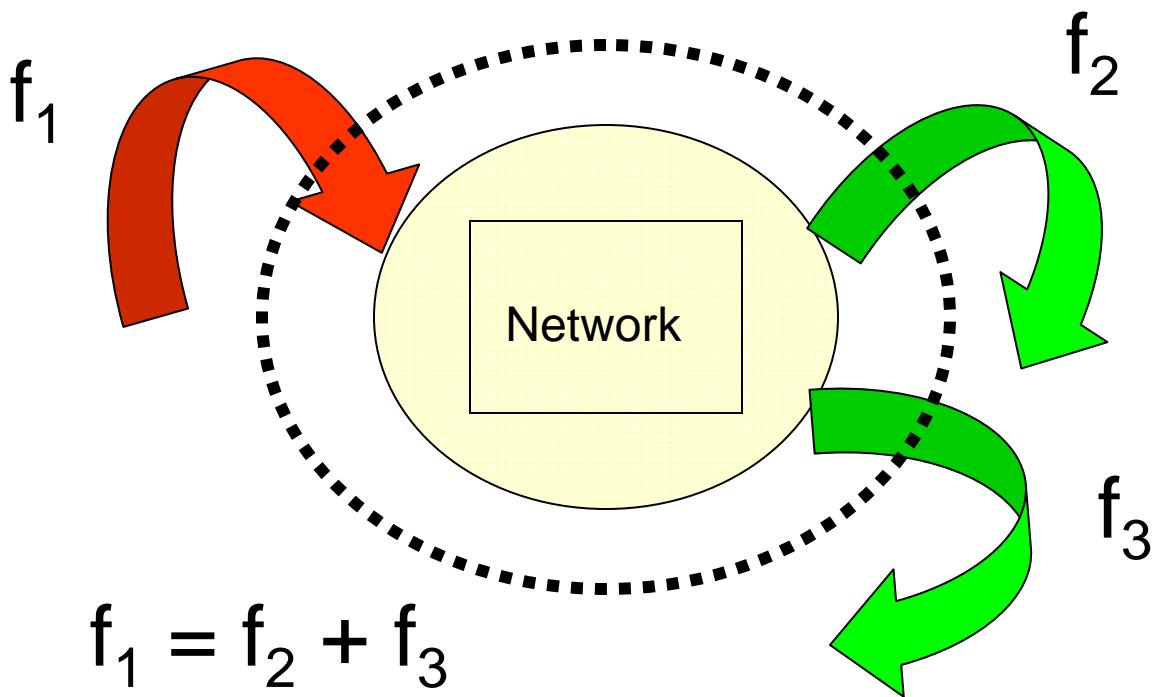
## Kirchhoff's Law and Cut sets

Area 5

$\Sigma$  Currents = 0 into a node.



Kirchoff's Law also applies in Graph Theory

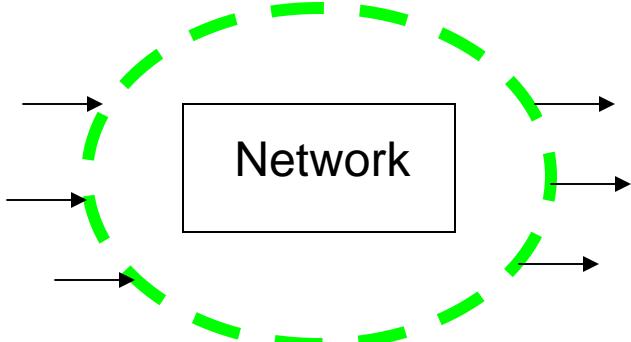


# Part 1-C – Issues of Vulnerability and Performance

Kirchhoff's Law and Cut sets

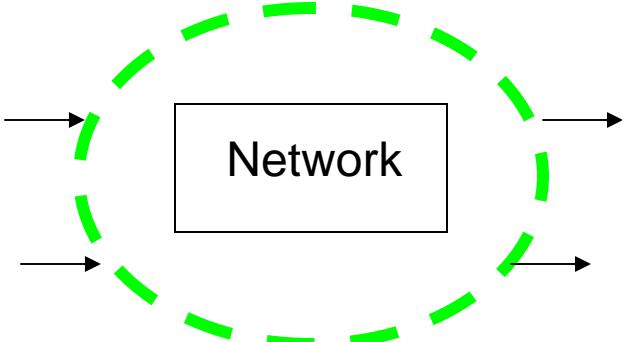
Area 5

## Maximum Flow



Cut set: flows in = flows out  
= 10 units

## Minimal Flow



Cut set: flows in = flows out  
= 1 unit

$$\text{ATOF: } f_x + f_2 + f_4 + f_6 + f_8 = f_1 + f_3 + f_5 + f_7 + f_x$$

$$\text{PS: } f_{11} + f_1 = f_9 + f_2 + f_{12}$$

$$\text{RS: } f_{15} + f_7 + f_9 + f_{13} = f_{10} + f_8$$

$$\text{FS: } f_{10} + f_{12} + f_3 = f_{14} + f_{13} + f_4 + f_{11}$$

$$\text{CS: } f_5 + f_{14} = f_{15} + f_6$$

$$\text{Sensitivity} = S_w := \lim_{\Delta W \rightarrow 0} \frac{\frac{\Delta T}{T}}{\frac{\Delta W}{W}} = \frac{\partial T}{\partial W} \frac{W}{T} \quad (T \neq 0)$$

Let  $T$  = cut set flow, let  $W$  be the MI =  $I(x;y)$ .

$j = 1, \dots, 11$  free chromosomes

3 bit word for each chromosome.

$j = 1$

0	1	1
---	---	---

$j = 2$

0	0	1
---	---	---

...

$j = 11$

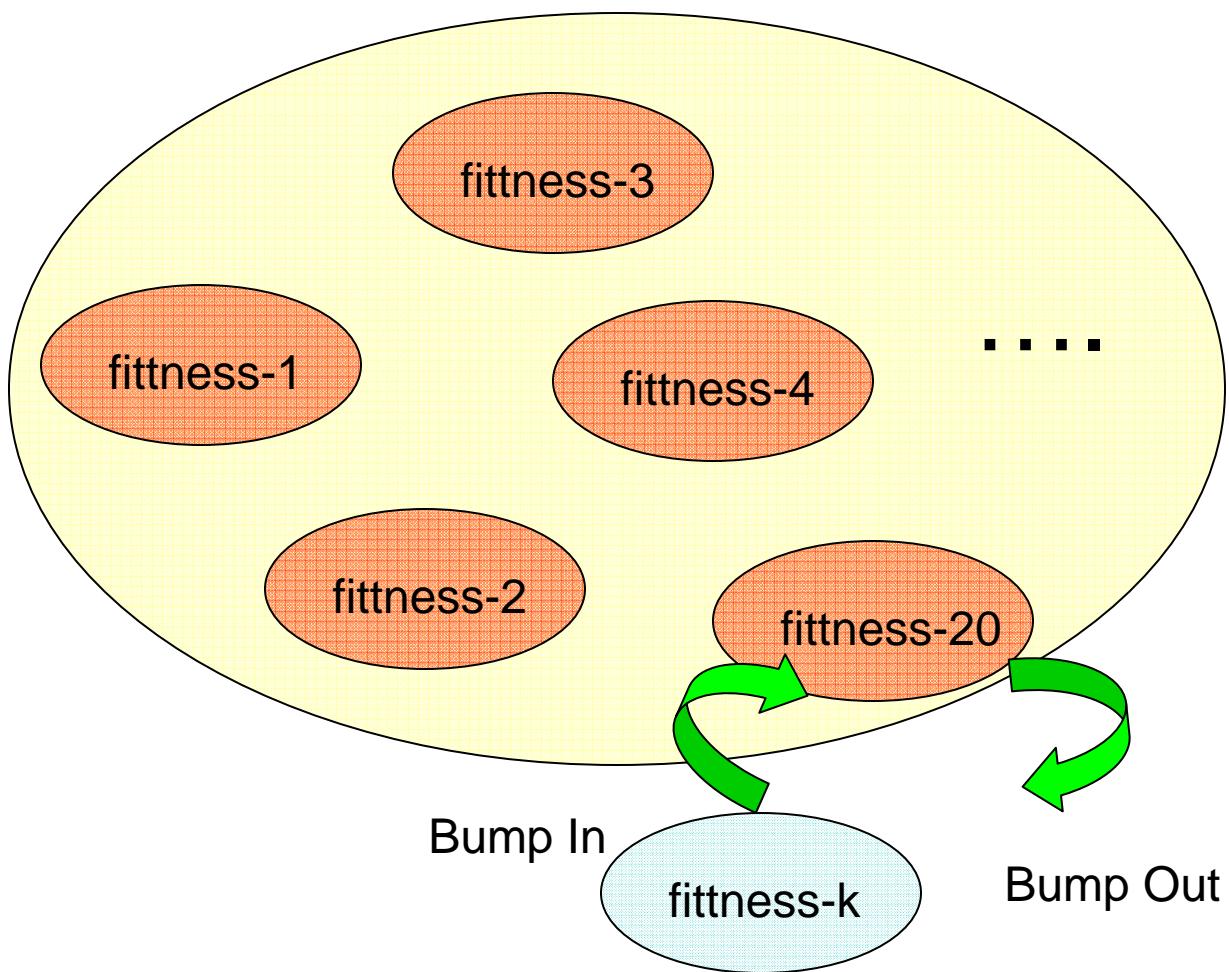
1	0	1
---	---	---

( $8^{11}$  possibilities, NP Hard)

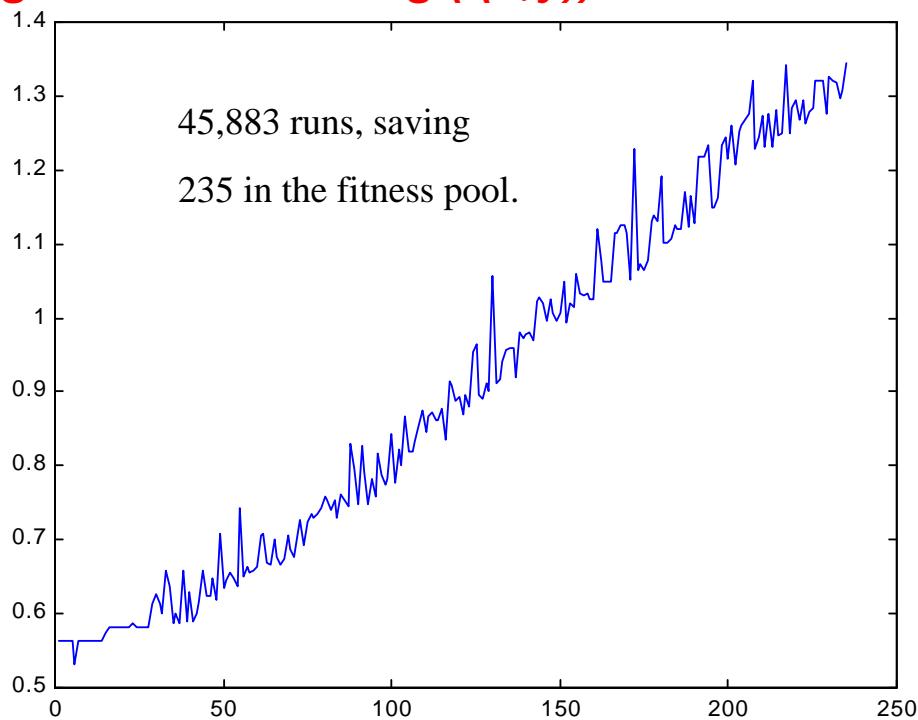
***Fig. 9 Configuration for the Chromosome***

Area 5

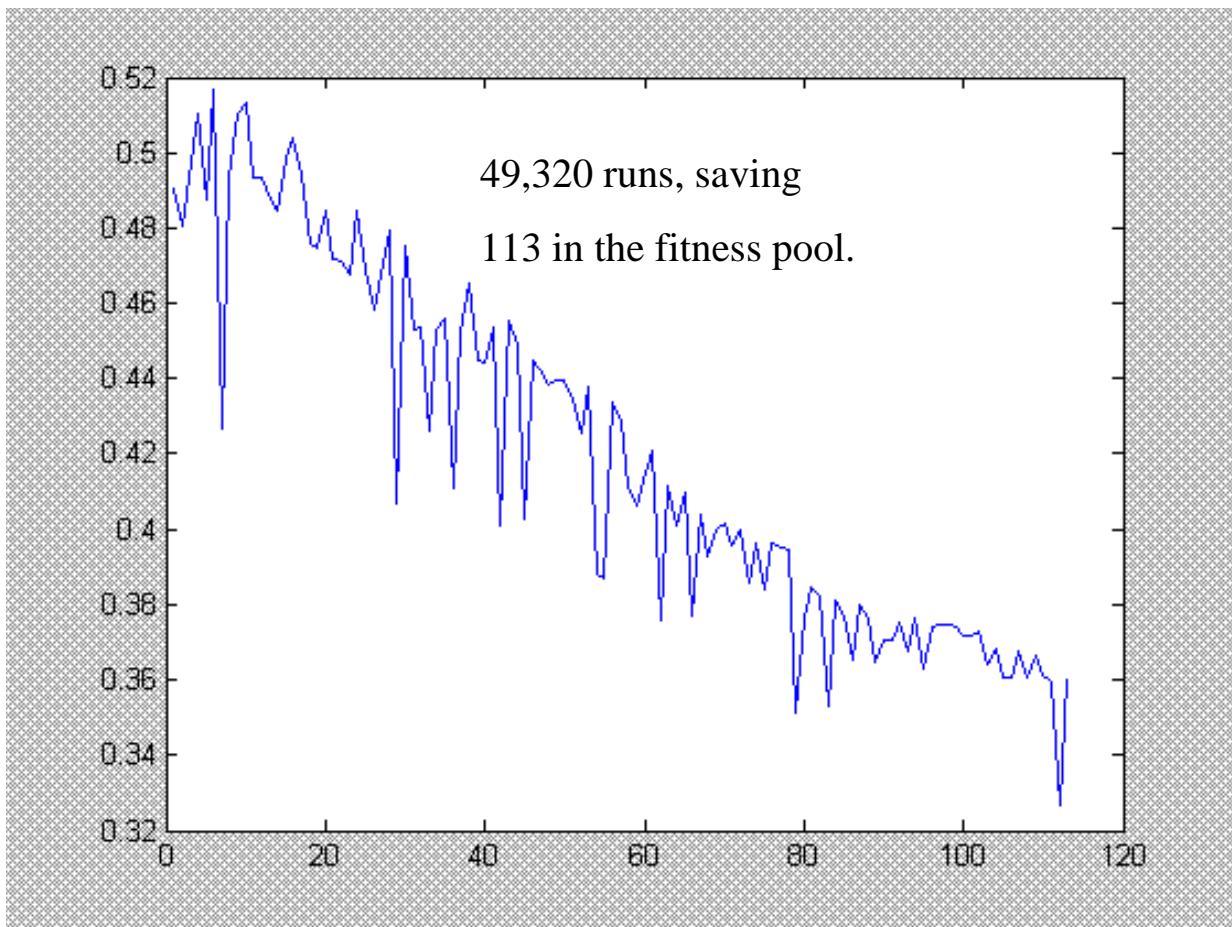
## How the Optimization is Conducted (Elite Pool)



**Fig. 10 – Maximizing ( $I(x;y)$ ) vs. Pool Entrance Number**



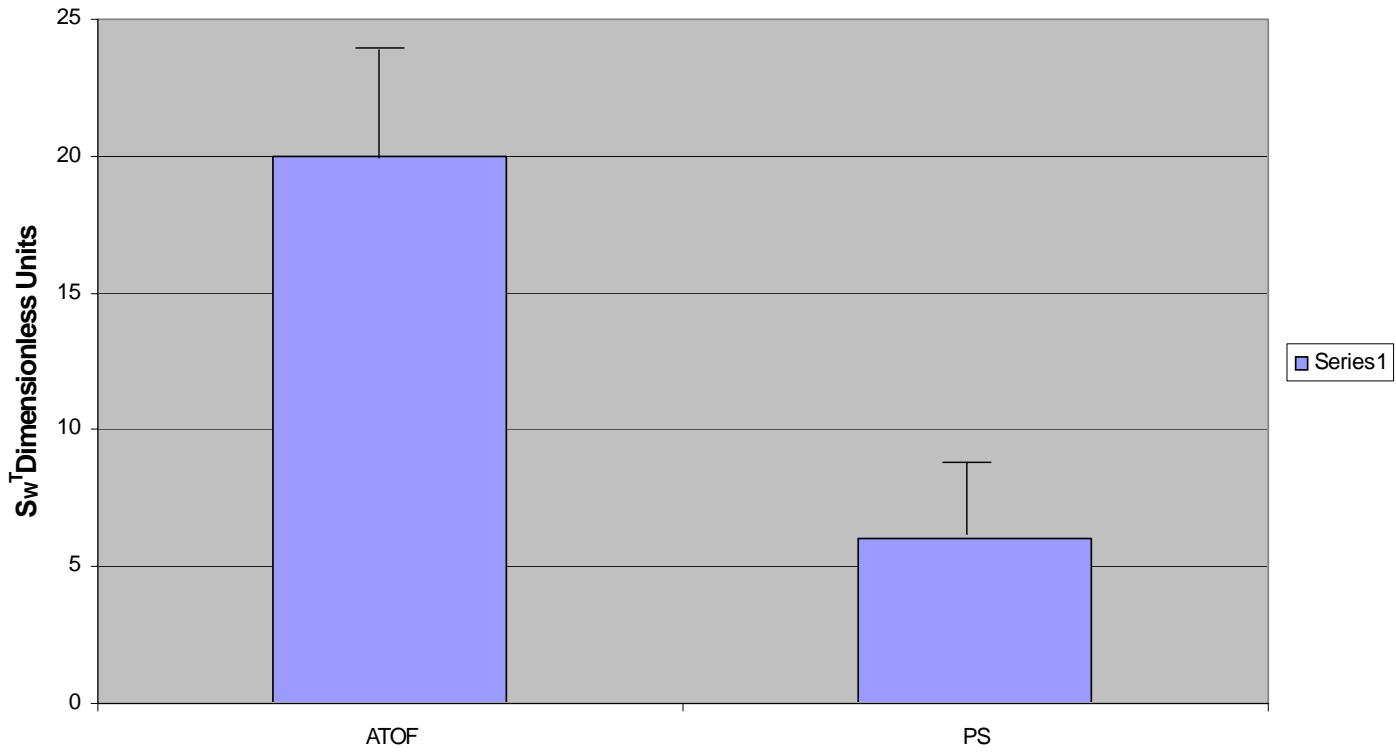
**Fig. 11 –  $I(x;y)$  Minimization vs. Pool Entrance Number**



# Sensitivity Results – Logistics Problem

Area 5

Sensitivity function in equation (32) for 5 computer runs



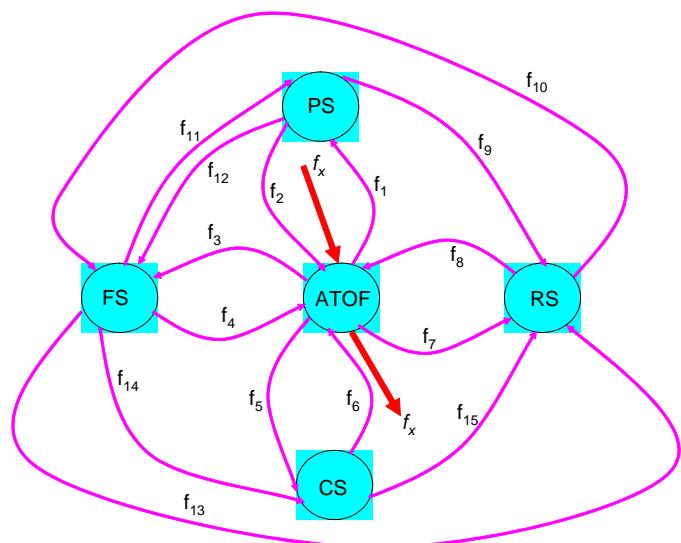
ATOF vs PS for 5 computer simulation runs

Figure (12) –The sensitivity Function defined in equation (32) for ATOF vs PS

Simulation is

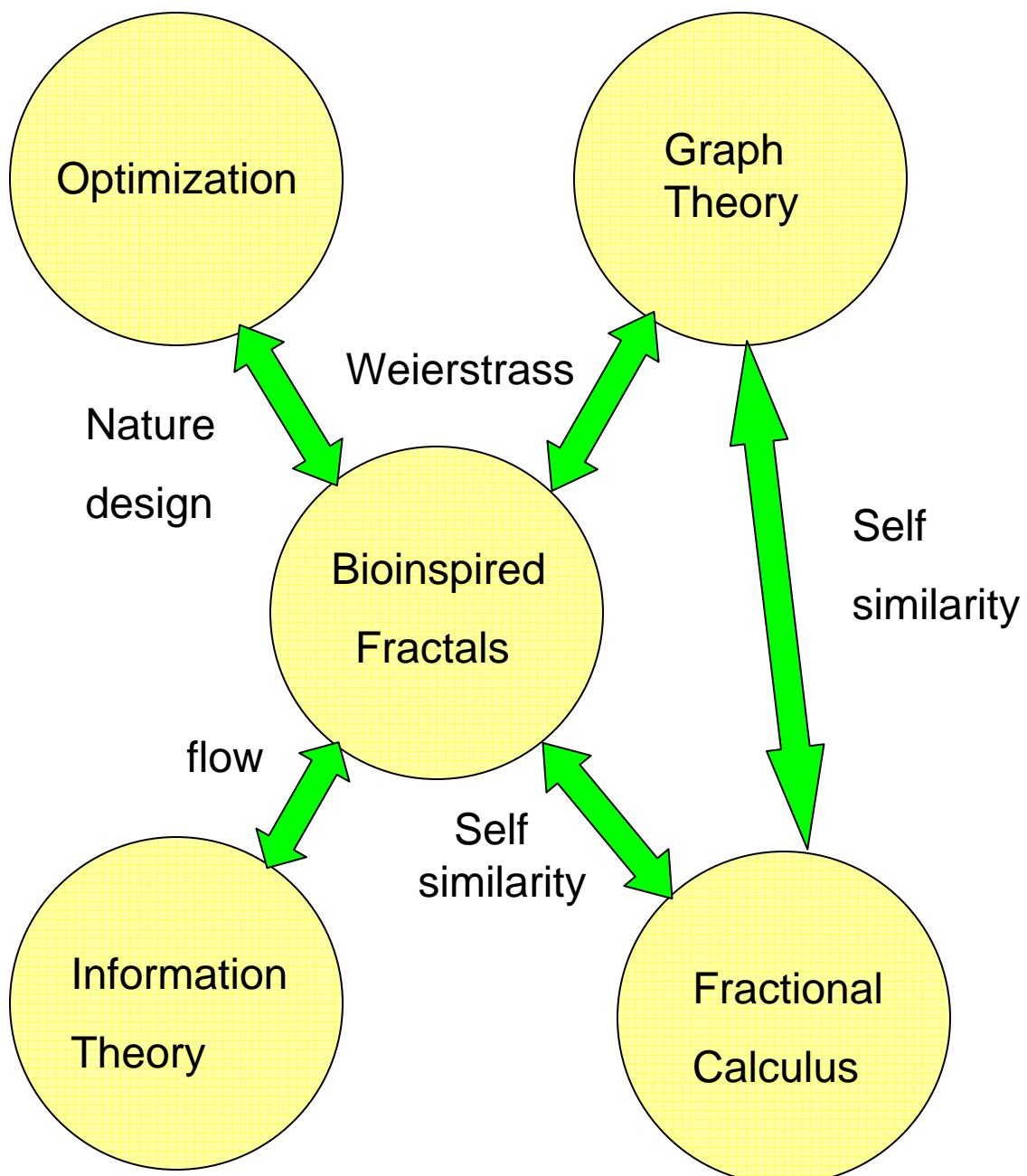
Sometimes termed

***“Experimental  
Mathematics”***



# Other Common Intersections

## *Causality Map*



## Part D -What is the solution in a theoretical sense?

- . Bioinspired  $\Rightarrow$  Perhaps we should not think Euclidean?
- . Fractional Calculus may capture dynamics.
- . Here may be a hypothesized solution?

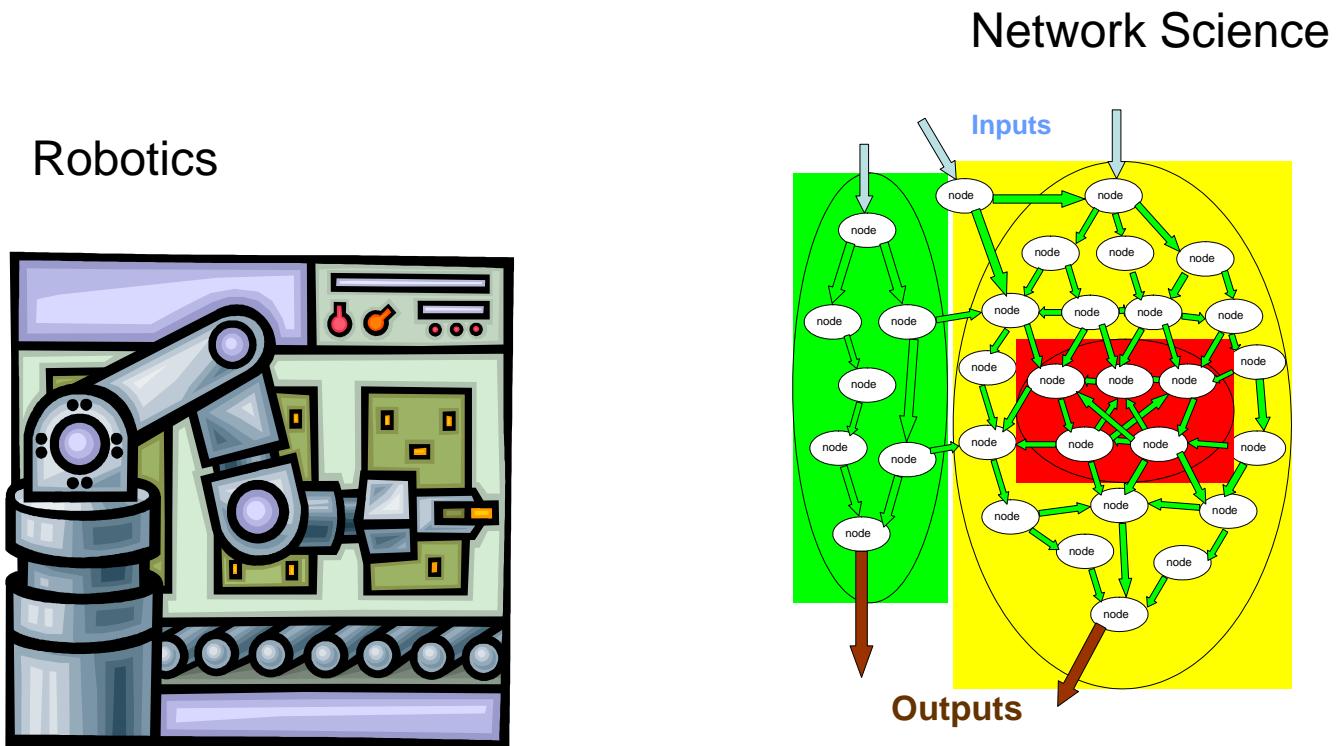


Figure 3 – The Original Network-Centric Distributed System

Minimize ( $J_1$ )

Minimize/Maximize ( $I(x;y)$ )

Subject to constraints:

$$\dot{x} = J\dot{\theta}$$

Subject to Constraints:

$$\sum f_i = 0$$

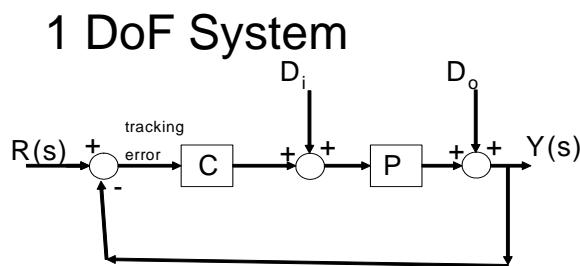
$$\frac{d^{5/2}(\alpha y)}{d(\alpha t)^{5/2}} + \frac{d^{3/2}(\alpha y)}{d(\alpha t)^{3/2}} + \frac{d^{1/2}(\alpha y)}{d(\alpha t)^{1/2}} = \frac{d^{3/2}(\alpha u)}{d(\alpha t)^{3/2}} + \frac{d^{1/2}(\alpha u)}{d(\alpha t)^{1/2}}$$

## End of Part I – Quantitative Biofractal Feedback

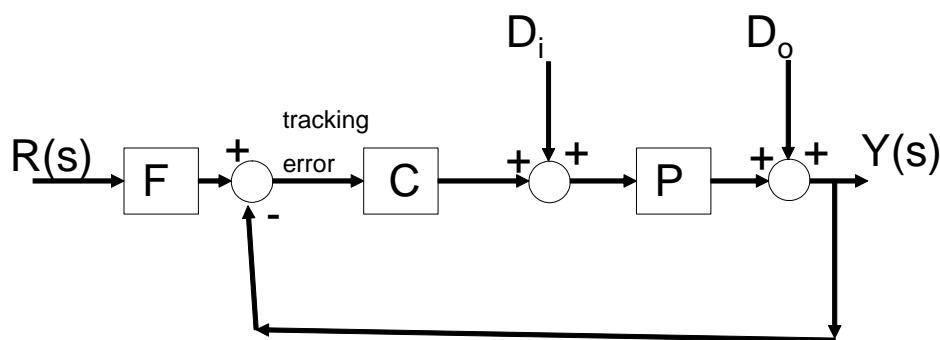
- . Performance and vulnerability of distributed systems needs to be objectively quantified.
- . We can learn from biological systems (fractals). Also the fractional calculus may offer a venue to characterize dynamics.
- . There are many common connections between five different areas. For example, the diffusion equation is bioinspired.
- . Computational methods allow us to synthesize a brute force approach for insight.
- . Much more work needs to be accomplished.

# Part II – Brief Review of QFT

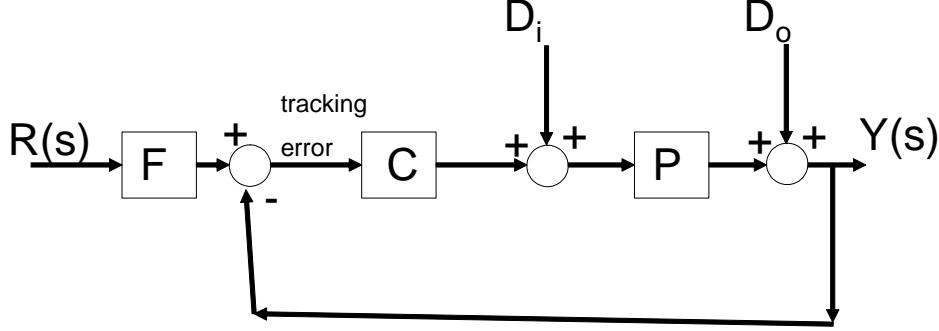
- . Quantitative Feedback Theory originated in the 1960's by Isaac Horowitz using frequency domain methods for efficient robust control design. In 1972 a seminal paper was published.
- . QFT has been used in Flight Control, Robotics, Power Systems, unmanned air vehicles, and many other applications.
- . The controller is determined by a loop shaping process employing a Nichols' Chart that displays the stability, performance and disturbance rejection bands.
- . A typical QFT Controller (synthesis) satisfies certain attributes:
  - (a) Robust Stability.
  - (b) Reference Tracking.
  - (c) Disturbance Rejection.



**2 DoF System**



# QFT Basics



In the Absence of Disturbances  $D_i$  and  $D_o$ :

Let:  $L = \text{Loop Gain}:$

$$L = C P$$

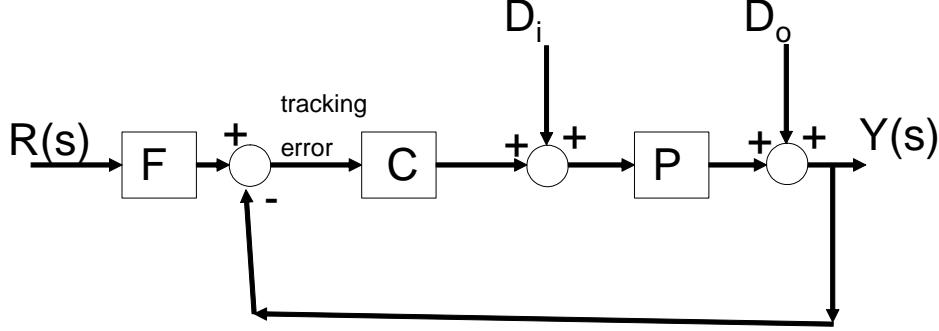
Then the closed loop transfer function between  $Y$  and  $R$  is:

$$\frac{Y(s)}{R(s)} = T(s) = \frac{F(s)L(s)}{1 + L(s)} = \frac{\text{Output}}{\text{Input}}$$

The Sensitivity of The Closed Loop Transfer Function  $T(s)$  to plant variations  $P(s)$  can be specified via:

$$S(s) = \frac{\frac{\partial T}{\partial P}}{P} = \frac{1}{1 + L(s)}$$

# QFT Basics



For QFT Design, we have at least 3 criteria to meet:

(1) Robust Stability (closed loop Robust Stability)

$$\left| \frac{L(s)}{1 + L(s)} \right| \leq \gamma$$

⇒ This is a constraint on the peak magnitude of the closed loop frequency response.

(2) Reference Tracking. Let  $T_L$  and  $T_U$  be the upper and lower transfer functions, then we require:

$$|T_L(j\omega)| \leq |T(j\omega)| \leq |T_U(j\omega)|$$

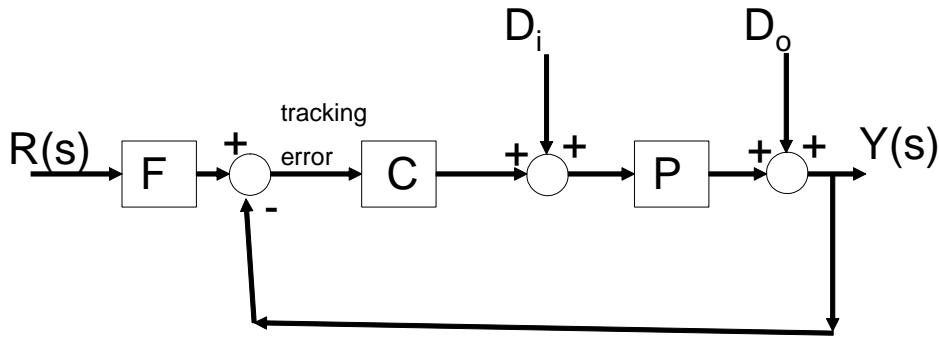
(3) Disturbance Rejection: We require:

$$\left| \frac{1}{1 + L(j\omega)} \right| \leq \frac{1}{W(j\omega)}$$

Where  $W(j\omega)$  is a weighting function (of frequency).

Note conditions (1-3) are for the class of plants  $P \in \{P_i\}$

# QFT Basics



For the Disturbances  $D_i$  and  $D_o$

The Transfer Function between  $D_i$  and  $Y$  is given by:

$$T_{di} = \frac{Y(j\omega)}{D_i(j\omega)} = \frac{P(j\omega)}{1 + L(j\omega)}$$

The Transfer Function between  $D_o$  and  $Y$  is given by:

$$T_{do} = \frac{Y(j\omega)}{D_o(j\omega)} = \frac{1}{1 + L(j\omega)}$$

Then the Disturbance Rejection Can Be Specified via:

$$|T_{di}| \leq B_{di} \quad |T_{do}| \leq B_{do}$$

Where the  $B_{di}$  and  $B_{do}$  are frequency dependent functions.

# Some References Selected from the QFT Area

(from 164 hits in IEEE Explore, and other sources)

1. I. M. Horowitz, "Synthesis of Feedback Systems with Nonlinear Time-varying Uncertain Plants to Satisfy Quantitative Performance Specifications," *IEEE Proc.*, **64**, 1976, pp.123-130.
2. I. M. Horowitz, "Feedback Systems with Nonlinear Uncertain Plants," *Int. J. Control.*, **36**, pp. 155-171, 1982.
3. D. E. Bossert, G. B. Lamont, M. B. Leahy, and I. M. Horowitz, "Model-Based Control with Quantitative Feedback Theory," *Proceedings of the 29<sup>th</sup> IEEE Conference on Decision and Control*, 1990, pp. 2058-2063.
4. D. G. Wheaton, I. M. Horowitz, and C. H. Houpis, "Robust Discrete Controller Design for an Unmanned Research Vehicle (URV) Using Discrete Quantitative Feedback Theory," *1991 NAECON*, May, pp. 546-552.
5. C. H. Houpis, and P. R. Chandler, "Quantitative Feedback Theory Symposium Proceedings," WL-TR-92-3063, August, 1992.
6. I. M. Horowitz, *Quantitative Feedback Design Theory (QFT)*, vol. 1, QFT Publications, 1993.
7. S. G. Breslin and M. J. Grimble, "Longitudinal Control of an Advanced Combat Aircraft using Quantitative Feedback Theory," *Proceedings of the 1997 ACC*, pp. 113-117.
8. D. S. Desanj and M. J. Grimble, "Design of a Marine Autopilot using Quantitative Feedback Theory," *Proceedings of the ACC*, 1998, pp. 384-388.

# Some References Selected from the QFT Area

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# **QFT**

# **Applications**

# Part III – The Diffusion Equation

Why?

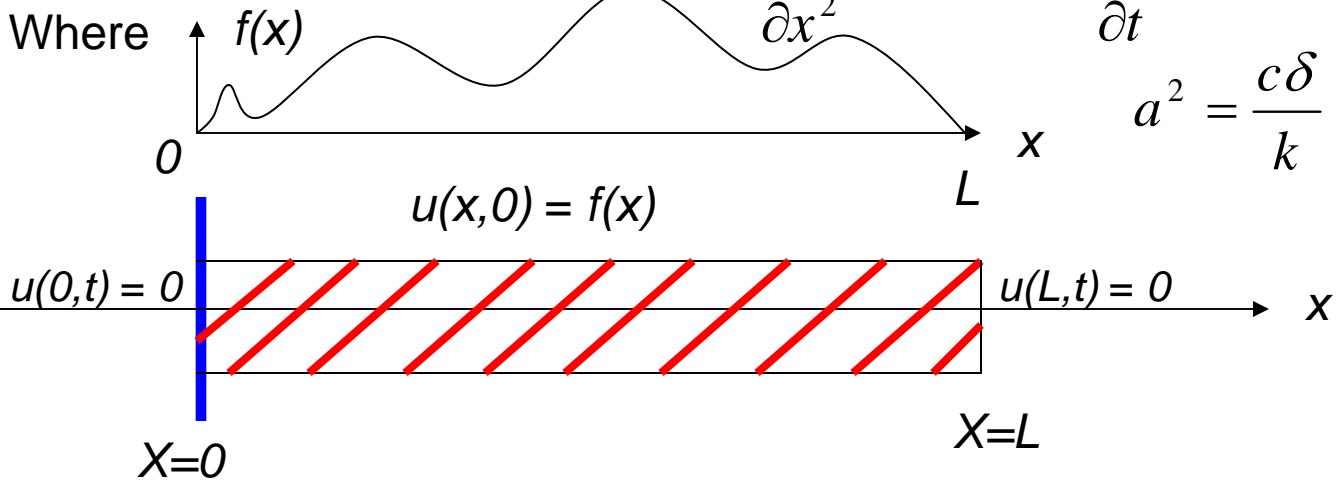
- (1) Many biological systems can be characterized in this manner.
- (2) Outside biology, diffusion is a fundamental process (thermal chemical, other physical processes of all types).
- (3) The diffusion equation satisfies a fractional differential equation.
- (4) The diffusion equation is also a type of fractal.

## **Consider the following physical problem:**

Let  $u(x,t)$  be the temperature distribution in a cylindrical bar of finite length  $L$  oriented along the  $x$ -axis and perfectly insulated laterally. We assume heat flow in only the  $x$  axis direction. The temperature  $u(x,t)$  satisfies:

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t}$$

Where



and  $k$  is the thermal conductivity,  $c$  is the specific heat and  $\delta$  is the linear density (mass/unit length).

The initial condition is:  $u(x,0) = f(x)$

The boundary conditions are:  $u(0,t) = 0 = u(L,t)$   $\forall t$

## Part III – The Diffusion Equation

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t}$$

$u(0,t) = 0 = u(L,t)$  *Boundary Conditions*

$u(x,0) = f(x)$  *Initial Condition*

Possible ways to solve the equation:

- (1) Fourier Method – Separation of Variables.
- (2) Laplace Transforms.
- (3) Fractional Calculus.

Now examine Robustness via Quantitative Feedback Theory

# Part III – The Diffusion Equation

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t} \quad \text{Initial Condition} \quad u(x,0) = f(x)$$

*Boundary Conditions:*  $u(0,t) = 0 = u(L,t)$

## (1) Fourier Method – Separation of Variables.

Assume  $u(x,t) = X(x)T(t)$

$$\Rightarrow a^2 X(x) \dot{T}(t) = T(t) X''(x)$$

$$\Rightarrow \frac{a^2 \dot{T}(t)}{T(t)} = \frac{X''(x)}{X(x)} = \text{constant} = -\lambda$$

$$\Rightarrow \dot{T}(t) = -(\lambda/a^2)T(t) \quad \Rightarrow \quad T(t) = A e^{-(\lambda/a^2)t}$$

and  $X''(x) = -\lambda X(x)$

$$\Rightarrow X(x) = B \sin(\sqrt{\lambda}x) + C \cos(\sqrt{\lambda}x) \quad \text{but } u(0,t) = 0 \Rightarrow C=0$$

$$\Rightarrow u_i(x,t) = T_i(t)X_i(x)$$

Note:  $\sqrt{\lambda} = \frac{n\pi}{L}$

and  $u(x,t) = \sum u_i(x,t)$

because  $u(L,t)=0 \forall t$

$$\Rightarrow u(x,t) = \sum_{n=1}^{\infty} D_n \left( \sin\left(\frac{n\pi x}{L}\right) e^{-\frac{(n^2\pi^2 t)}{(a^2 L^2)}} \right)$$

$$D_n = \frac{2}{L} \int_0^L f(x) \sin\left(\frac{n\pi x}{L}\right) dx$$

(Can show the infinite series converges)

# Part III – The Diffusion Equation

$$\frac{\partial^2 u(x,t)}{\partial x^2} = \frac{\partial u(x,t)}{\partial t}$$

Initial Condition     $u(x,0) = f(x)$

$u(x,t)$  bounded,  $t > 0$ ,  $-\infty < x < \infty$

## (2) Laplace Transforms.

Define the Laplace Transform Variable:  $U(x,s) = \int_0^\infty e^{-ts} u(x,t) dt$

$$\Rightarrow \int_0^\infty e^{-ts} \frac{\partial u}{\partial t} dt = sU(x,s) - u(x,0) = sU(x,s) - f(x)$$

If  $\frac{\partial u}{\partial x}$  and  $\frac{\partial^2 u}{\partial x^2}$  are bounded and continuous

$$\int_0^\infty e^{-st} \frac{\partial^2 u}{\partial x^2} dt = \frac{\partial^2 U}{\partial x^2}$$

Now Laplace transform the partial differential equation

$$0 = L \left[ \frac{\partial u}{\partial t} - \frac{\partial^2 u}{\partial x^2} \right] = sU(x,s) - f(x) - \frac{\partial^2 U}{\partial x^2}$$

Forcing Function

and solve for  $U(x,s)$ :

$$U(x,s) = \frac{1}{2\sqrt{s}} \int_{-\infty}^{+\infty} e^{-\sqrt{s}|x-y|} f(y) dy$$

To find  $u(x,t)$ , we need to find the inverse Laplace transform

$$u(x,t) = L^{-1}[U(x,s)]$$

or

$$u(x,t) = L^{-1} \left[ \frac{1}{2\sqrt{s}} \int_{-\infty}^{+\infty} e^{-\sqrt{s}|x-y|} f(y) dy \right]$$

By integration in the complex plane we can show:

$$u(x,t) = \frac{1}{\sqrt{2\pi t}} \int_{-\infty}^{\infty} e^{-(x-y)^2/4t} f(y) dy$$

# Part III – The Diffusion Equation

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t} \quad \text{Initial Condition} \quad u(x,0) = f(x)$$

*Boundary Conditions:*  $u(0,t) = 0 = u(L,t)$

(Heaviside Operational Calculus)

Consider:  $\frac{\partial^2 u}{\partial x^2} = a^2 \frac{\partial u}{\partial t}$

Let  $p = \frac{\partial}{\partial t} \Rightarrow \frac{\partial^2 u}{\partial x^2} = a^2 p u$

(treat  $p$  as a constant and solve for  $x$ )

$$\Rightarrow u(x,t) = A e^{-ap^{1/2}x} + B e^{ap^{1/2}x}$$

On physical grounds,  $B = 0$

$$\Rightarrow u_i(x,t) = e^{-axp^{1/2}} u_0$$

Or:  $u(x,t) = u_0 + \sum_{n=1}^{\infty} \frac{(-ax)^n}{n!} p^{n/2} u_0$

(can ignore positive integral powers of  $p$ )

$$\Rightarrow u(x,t) = u_0 - \frac{2u_0}{\sqrt{\pi}} \int_0^{\frac{ax}{2\sqrt{t}}} e^{-\xi^2} d\xi$$

# Part III – The Diffusion Equation

$$\frac{\partial^2 u(x,t)}{\partial x^2} = a^2 \frac{\partial u(x,t)}{\partial t} \quad \text{Initial Condition} \quad u(x,0) = f(x)$$

*Boundary Conditions:*  $u(0,t) = 0 = u(L,t)$

Now examine Robustness via Quantitative Feedback Theory

**Step 1:** Let us examine a heat control problem.

(Define units of all quantities to generalize. )

**Step 2:** Let us build a controller within a QFT context.

**Step 3:** We have now solved a heat control problem. Now  
generalize to flow problems as in networks.  
Again look at the units of all variables.

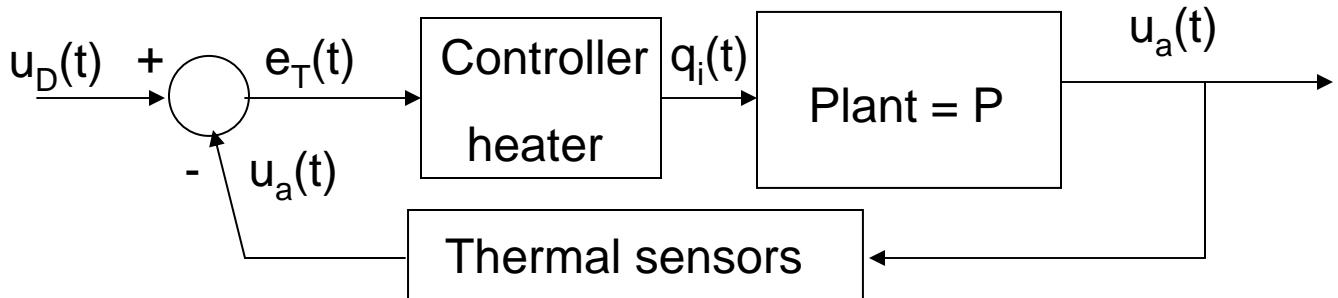
# Part III

**Step 1:** Let us examine a heat control problem.

Let  $u_{\text{desired}}(x,t) = \text{desired temperature} = u_D(t)$  (assume  $x=\text{const}$ ).

Let  $u_{\text{actual}}(x,t) = \text{actual temperature} = u_a(t)$

Temperature error  $e_T(t) = u_D(t) - u_a(t)$



**Units Analysis:**  $u_i(t) = \text{temperature} - \text{C}^\circ$

$C = \text{Thermal Capacitance} = \text{kilo cal / C}^\circ$

$q(t) = \text{heat input} - \text{kilo cal / second}$

$R_T = \text{Thermal Resistance} - \text{C}^\circ \text{ sec / kilo cal}$

$$\text{Then: } C \frac{du_a}{dt} = q_i - q_0 \quad \text{Where: } q_0 = \frac{u_a}{R_T}$$

$$C \frac{du_a}{dt} + q_0 = q_i$$

$$C \frac{du_a}{dt} + \frac{u_a}{R_T} = q_i$$

$$R_T C \frac{du_a}{dt} + u_a = R_T q_i$$

$$\frac{U_a(s)}{Q_i(s)} = \frac{R_T}{1 + R_T C s}$$

# Part III

**Step 2:** Let us build a controller within a QFT context

**QFT Goals:**

$$(1) \text{ Stability} \quad T(s) = \frac{L}{1+L} \quad \text{is stable.} \quad L = G P$$

(2) Tracking Specifications

$$|T_L(j\omega)| \leq |F(j\omega) T(j\omega)| \leq |T_u(j\omega)| \Rightarrow \text{use } F \text{ for prefilter.}$$

$$T_{Di} = \frac{P}{1+L}$$

(3) Disturbance Rejection

$$\max |T_D(j\omega)| \leq |M_D(j\omega)|$$

$$T_{D0} = \frac{1}{1+L}$$

**QFT Design Procedure:**

(a) Find the plant templates  $P_\varepsilon \{P_i\}$  – Nichols chart.

(b) Generate Performance Bounds from Nichols chart.

$$L_0(s) = P_0(s) G(s)$$

(c) Loop Shaping: Add poles and zeros to  $L_0(s)$ .

(d) Design Prefilter  $F$  ( keep  $|T_L| < |FT| < |T_u|$  )

(e) Finally to determine the final controller

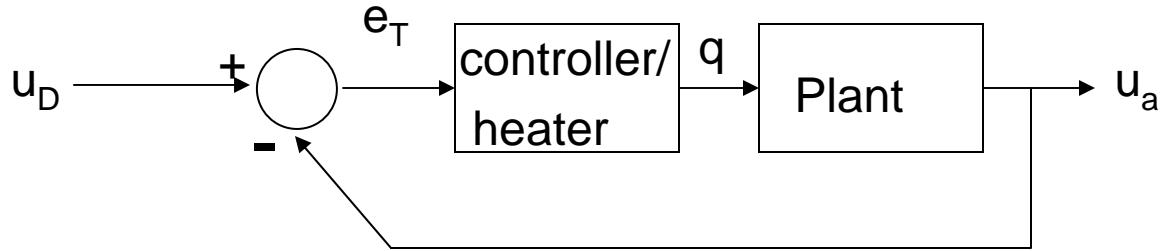
$$G(s) = \frac{\bar{L}_0(s)}{P(s)}$$

Done!

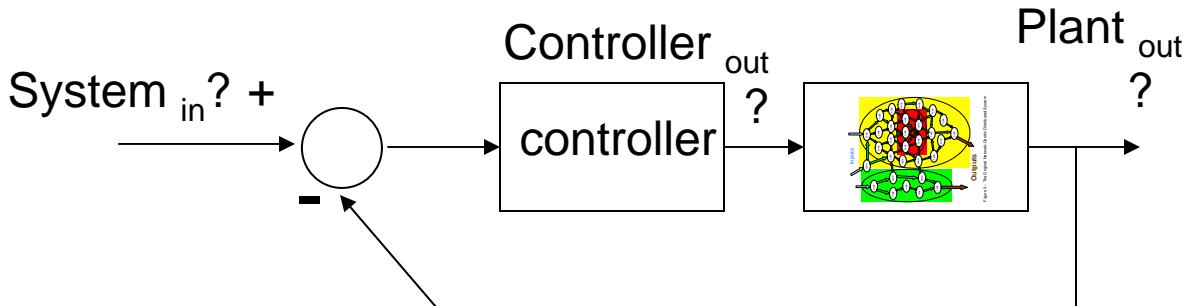
# Part III

**Step 3:** We have now solved a **heat control problem**. Now **Generalize** to flow problems as in networks.

Heat Control Problem:



The Network Flow Problem



Let us review the **units** of variables of interest:

## Heat Control Problem

$u_1$  units of ( $C^0$ )

$q$  units of (kilo cal/sec)

$C$  units of (kilo cal /  $C^0$ )

$$C \frac{du_a}{dt} = q_i - q_0$$

## Network Flow

System in ?

Controller out ?

Plant out ?

# Part III

**Step 3:** We have now solved a **heat control problem**. Now **Generalize** to flow problems as in networks.

Suggestions:

Heat Control Problem – flow

$$q * \text{time} = \text{kilo calories}$$

Network Problem – flow

$$\text{bits/sec} * \text{seconds} = \text{bits}$$

$$\text{events/second} * \text{seconds} = \text{events}$$

Equate the above variables ( $MI = q$ , events = kilo calories)

$$u = \frac{1}{C} \int q(\tau) d\tau$$

$$\text{events} = \text{bits} = \int (\text{mutual information}) dt$$

## Heat Control Problem

$u$  , units of ( $C^0$ )

$q$  units of (kilo cal/sec)

$C$  units of (kilo cal /  $C^0$ )

$$C \frac{du_a}{dt} = q_i - q_0$$

(Recall we **modulated**  $MI$  in the example)

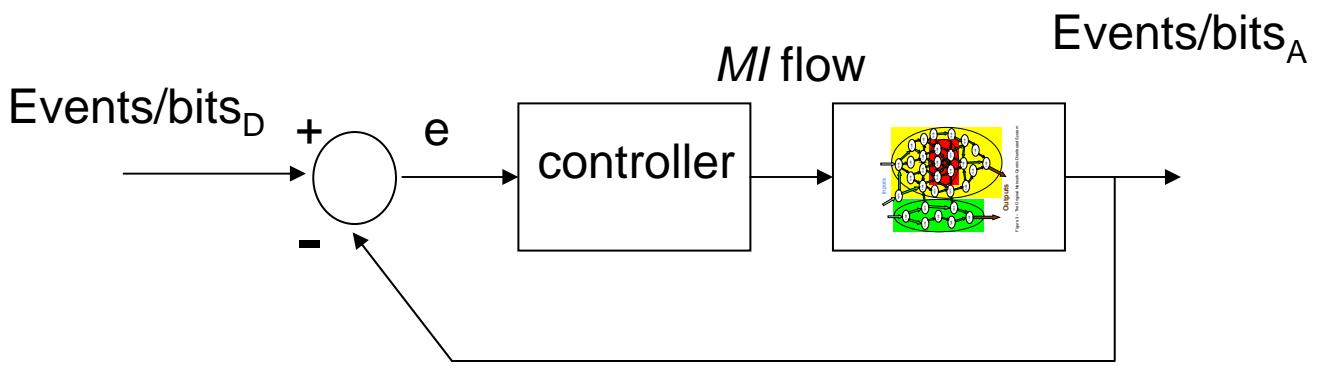
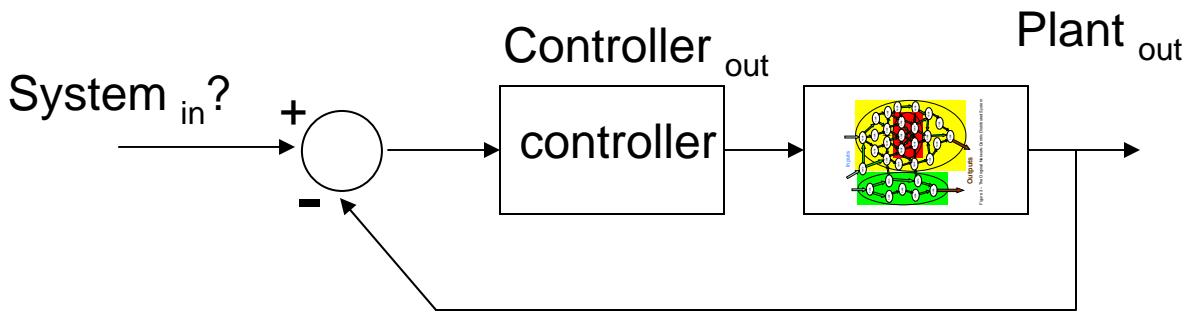
## Network Flow

System <sub>in</sub> ? =  $\int MI$

Controller <sub>out</sub> ? =  $MI$

Plant <sub>out</sub> ? =  $\int MI$

# Part III



## Network Flow

$$\text{System in ?} = \int MI$$

$$\text{Controller out ?} = MI$$

$$\text{Plant out ?} = \int MI$$

(Recall we **modulated** MI in the example)

# Summary and Conclusions

Part I – Fractional Dimensions –  
non Euclidean World.

Part II – Quantitative Feedback  
Theory.

Part III – Diffusion Equation.

The Future - Modeling networks as control systems and applying these techniques. QFT helps because it can view robust control in terms of simple Bode/Nichols plots.